J.P. Morgan Fixed Income Quantitative and Systematic Strategies

Joshua Younger (AC) (1-212) 270-1323 joshua.d.younger@jpmorgan.com Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

Machine Learning Report: 09/06/2018

10Y Treasuries: buy/sell signal for 5-day trade horizon

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Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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10Y Treasuries: buy/sell signal for 5-day trade horizon

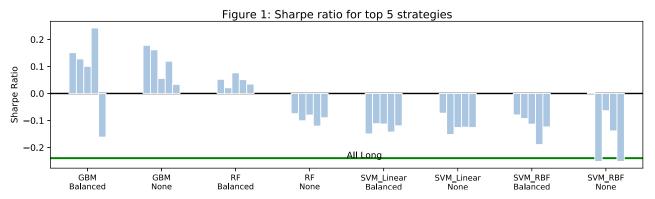
Quarantine Period: 01/03/2017 to 08/28/2018; Cross Validation Period: 01/03/2008 to 12/31/2016

Table 1: Current recommended direction, conviction level and relative sizing for average top 5 strategies

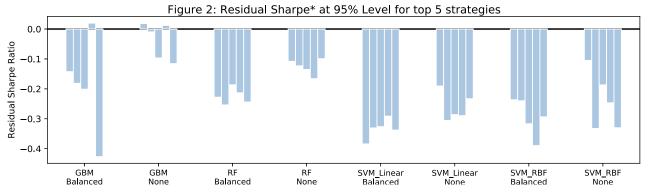
			Recommended Direction					Convic	tion*		Size*			
			Today	Yesterday	1w ago	1m ago	Today	Yesterday	1w ago	1m ago	Today	Yesterday	1w ago	1m ago
Weight	Algo	Rank												
Balanced	GBM	Avg	buy	buy	buy	buy	53%	51%	69%	68%	0.06	0.01	0.38	0.36
	RF	Avg	buy	buy	buy	buy	52%	52%	58%	58%	0.05	0.04	0.15	0.15
	SVM_Linear	r Avg	buy	buy	buy	buy	71%	62%	74%	73%	0.42	0.23	0.49	0.46
	SVM_RBF	Avg	buy	sell	buy	buy	65%	51%	64%	70%	0.3	-0.01	0.27	0.41
None	GBM	Avg	buy	buy	buy	buy	55%	52%	76%	75%	0.1	0.04	0.52	0.49
	RF	Avg	buy	buy	buy	buy	58%	57%	63%	63%	0.15	0.15	0.25	0.25
	SVM_Linear	r Avg	buy	buy	buy	buy	74%	65%	76%	74%	0.49	0.31	0.52	0.48
	SVM_RBF	Avg	buy	buy	buy	buy	72%	53%	72%	74%	0.45	0.06	0.45	0.49

Note: We include signals produced by Gradient Boosting Machine (GBM), Random Forest (RF), and Support Vector Machines (SVM) with Linear and Radial Basis Function (RBF) kernels. Balanced refers to equal weight across label class (buy/sell) and None has no class weight. Hyperparamter tuning based on a 5-fold cross validation during period defined above. Trained classifiers held constant over quarantine. Top 5 based on the higher Sharpe ratio in cross-validation. Average is the soft voting result of the top 5.

^{*} Conviction is the probability of a given signal estimated by the trained classifier. Sizes assume the Kelly criterion of (-1 + 2 * p).



Note: Figure 1 includes annualized Sharpe Ratio of top 5 strategies by algorithms over the Quarantine period. The Sharpe ratio of All Long* strategy is presented as a solid green horizontal line for benchmark. * All Long is the performance from uniform buy daily.



Note: Figure 2 includes Residual Sharpe* of top 5 strategies by algorithms over the Quarantine period.

^{*} Residual Shape is defined as the difference between the actual Sharpe from a given trained classifier and the 95th percentile outcome after randomly permuting daily trading signals over the Quarantine period. A positive residual represents a statistically significant improvement.

Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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10Y Treasuries: buy/sell signal for 5-day trade horizon

Quarantine Period: 01/03/2017 to 08/28/2018; Cross Validation Period: 01/03/2008 to 12/31/2016

Table 1: Current recommended direction, conviction level and relative sizing for top 5 strategies

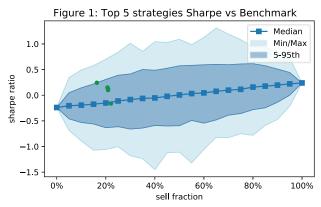
			Rec	ommende	ed Direc	tion		Convic	tion*		Size*				
			Today \	esterday	1w ago	1m ago	Today	Yesterday	1w ago	1m ago	Today	Yesterday	1w ago	1m ago	
Weight	Algo	Rank	-		3.	. 3		,	3.	- 3 -			3.	. 3	
		1	buy	buy	buy	buy	54%	51%	70%	67%	0.08	0.02	0.4	0.35	
		2	buy	buy	buy	buy	55%	51%	70%	67%	0.09	0.02	0.4	0.34	
	GBM	3	buy	buy	buy	buy	53%	51%	68%	66%	0.05	0.01	0.36	0.32	
		4	sell	sell	buy	buy	52%	54%	73%	71%	-0.03	-0.08	0.46	0.41	
		5	buy	buy	buy	buy	54%	55%	64%	69%	0.09	0.1	0.27	0.37	
		1	buy	buy	buy	buy	52%	52%	57%	58%	0.05	0.04	0.15	0.15	
		2	buy	buy	buy	buy	52%	52%	57%	57%	0.05	0.03	0.14	0.14	
	RF	3	buy	buy	buy	buy	52%	51%	57%	57%	0.04	0.03	0.15	0.15	
		4	buy	buy	buy	buy	52%	52%	57%	57%	0.05	0.04	0.14	0.14	
Balanced		5	buy	buy	buy	buy	53%	53%	59%	59%	0.06	0.06	0.19	0.18	
Dalaliceu		1	buy	buy	buy	buy	71%	61%	74%	72%	0.43	0.23	0.47	0.44	
		2	buy	buy	buy	buy	70%	60%	74%	72%	0.41	0.2	0.47	0.44	
	SVM_Linear	r 3	buy	buy	buy	buy	70%	60%	74%	72%	0.41	0.2	0.47	0.44	
		4	buy	buy	buy	buy	74%	66%	77%	77%	0.48	0.33	0.55	0.54	
		5	buy	buy	buy	buy	70%	60%	73%	72%	0.41	0.2	0.47	0.44	
		1	buy	sell	buy	buy	64%	51%	61%	70%	0.28	-0.01	0.22	0.4	
		2	buy	sell	buy	buy	66%	51%	63%	72%	0.32	-0.02	0.25	0.44	
	SVM_RBF	3	buy	sell	buy	buy	65%	50%	67%	70%	0.31	-0	0.34	0.39	
		4	buy	sell	buy	buy	66%	50%	68%	70%	0.31	-0	0.36	0.41	
		5	buy	sell	buy	buy	63%	51%	60%	69%	0.26	-0.03	0.21	0.39	
		1	sell	sell	buy	buy	52%	57%	79%	80%	-0.04	-0.13	0.58	0.6	
		2	sell	sell	buy	buy	52%	55%	77%	79%	-0.04	-0.1	0.54	0.59	
	GBM	3	buy	buy	buy	buy	60%	56%	75%	72%	0.19	0.12	0.5	0.43	
		4	buy	buy	buy	buy	59%	59%	73%	70%	0.19	0.18	0.47	0.4	
		5	buy	buy	buy	buy	60%	55%	76%	72%	0.2	0.1	0.51	0.44	
	RF	1	buy	buy	buy	buy	57%	57%	62%	63%	0.15	0.14	0.25	0.25	
		2	buy	buy	buy	buy	57%	57%	62%	62%	0.15	0.14	0.24	0.24	
		3	buy	buy	buy	buy	58%	58%	64%	64%	0.16	0.15	0.28	0.27	
		4	buy	buy	buy	buy	58%	58%	63%	63%	0.17	0.16	0.26	0.26	
None		5	buy	buy	buy	buy	58%	57%	62%	62%	0.15	0.14	0.24	0.24	
NOTIE		1	buy	buy	buy	buy	79%	72%	81%	79%	0.58	0.43	0.63	0.58	
		2	buy	buy	buy	buy	72%	62%	73%	72%	0.43	0.23	0.45	0.43	
	SVM_Linear	3	buy	buy	buy	buy	72%	62%	74%	72%	0.44	0.23	0.48	0.43	
		4	buy	buy	buy	buy	72%	62%	74%	72%	0.44	0.23	0.48	0.43	
		5	buy	buy	buy	buy	77%	70%	79%	77%	0.55	0.4	0.57	0.54	
	SVM_RBF	1	buy	buy	buy	buy	75%	56%	76%	76%	0.5	0.12	0.52	0.52	
		2	buy	buy	buy	buy	71%	51%	70%	73%	0.42	0.03	0.41	0.47	
		3	buy	buy	buy	buy	73%	54%	74%	75%	0.46	0.08	0.47	0.5	
		4	buy	buy	buy	buy	72%	53%	71%	74%	0.43	0.07	0.42	0.48	
		5	buy	buy	buy	buy	71%	51%	70%	73%	0.42	0.03	0.41	0.47	

Note: This is a detailed version of Table 1 on the first page, top 5 strategies' invidiual decisions are included.

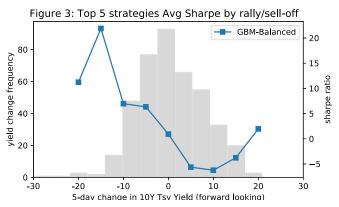
Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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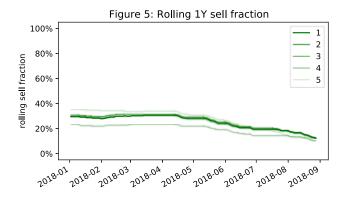
10Y Treasuries: Top 5 GBM-Balanced performance measurement



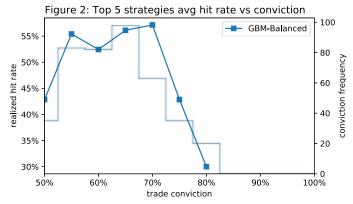
Note: Figure 1 compares top 5 strategies' Sharpe ratio (unitless) presented as green dots with percentiles of random trading decisions' Sharpe over Quarantine. Percentiles come from 1000 trials randomly permuting daily trading decisions at a fixed percentage of sell days (sell fraction) and then calculating sharpe ratio for each trial



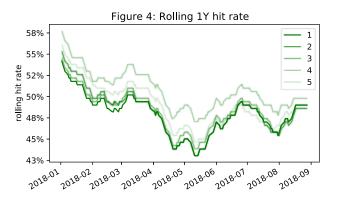
Note: Figure 3 presents average of top 5 strategies' Sharpe ratio (RHS; unitless) broken out by yield change (x-axis; bps) over Quarantine. Overlaid is the frequency of 5-day yield moves (LHS; counts).



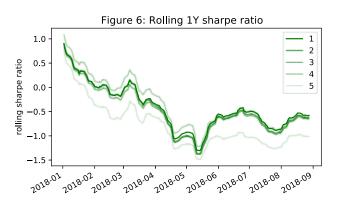
Note: Figure 5 presents top 5 strategies' rolling 1 year sell fraction (%) over Quarantine.



Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.

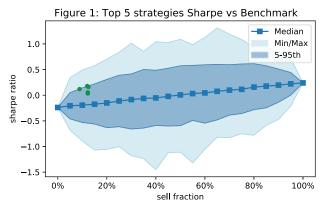


Note: Figure 6 presents top 5 strategies' rolling 1 year Sharpe ratio (unitless) over Quarantine.

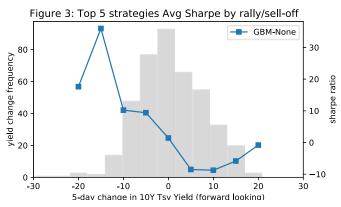
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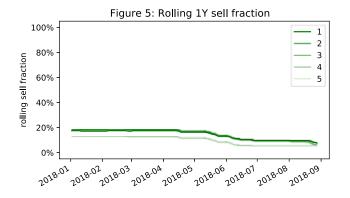
10Y Treasuries: Top 5 GBM-None performance measurement



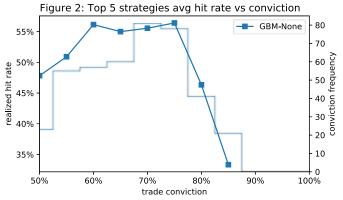
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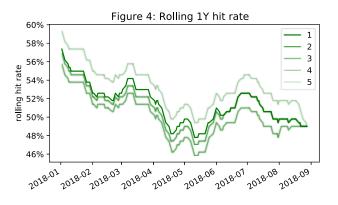
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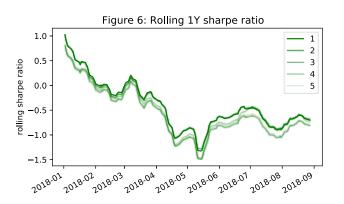
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Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.

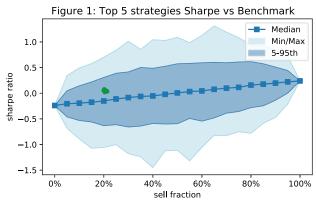


Note: Figure 6 presents top 5 strategies' rolling 1 year Sharpe ratio (unitless) over Quarantine.

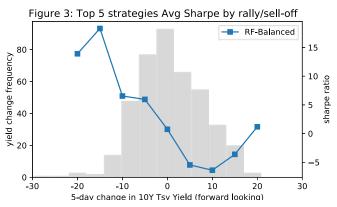
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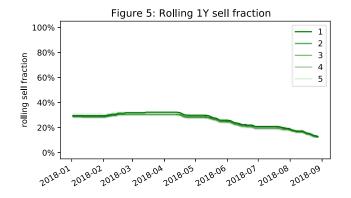
10Y Treasuries: Top 5 RF-Balanced performance measurement



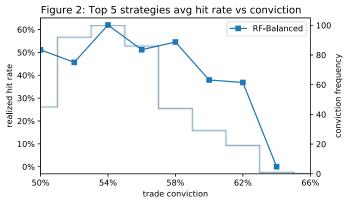
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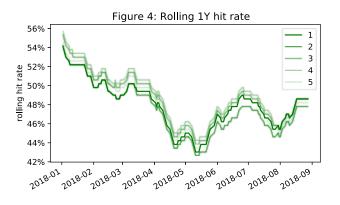
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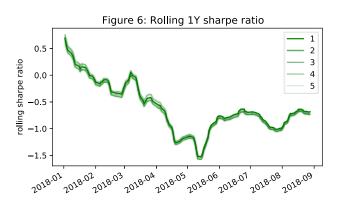
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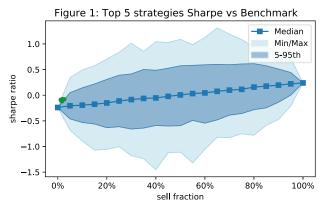


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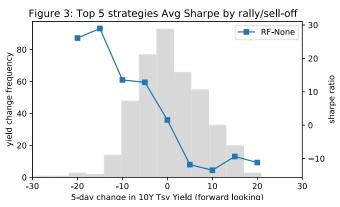
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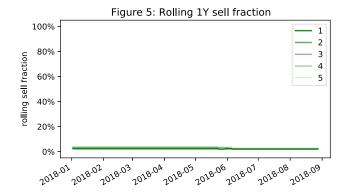
10Y Treasuries: Top 5 RF-None performance measurement



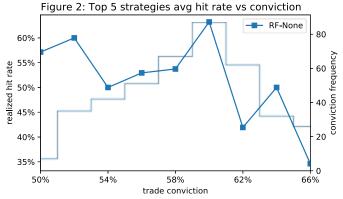
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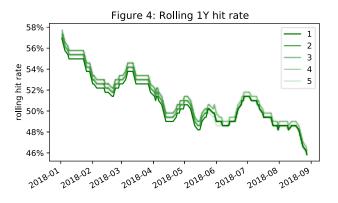
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Note: Figure 5 presents top 5 strategies' rolling 1 year sell fraction (%) over Quarantine.



Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.

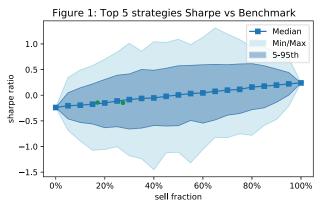


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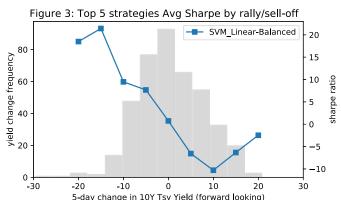
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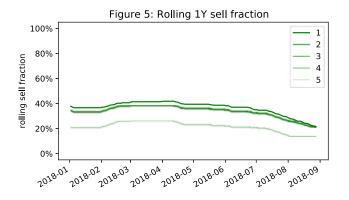
10Y Treasuries: Top 5 SVM-Linear-Balanced performance measurement



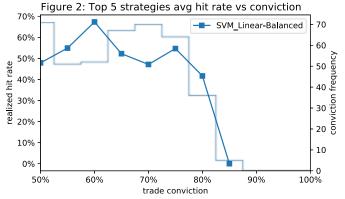
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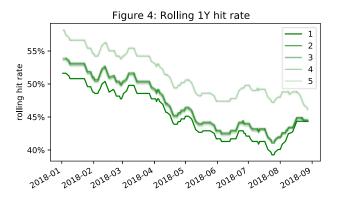
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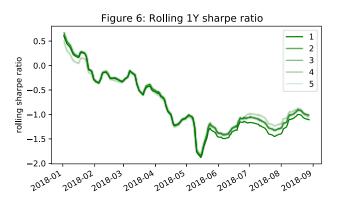
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Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.

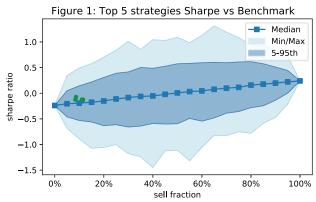


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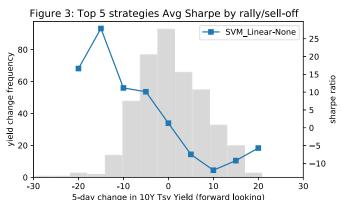
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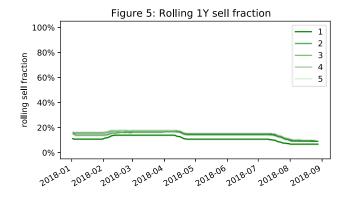
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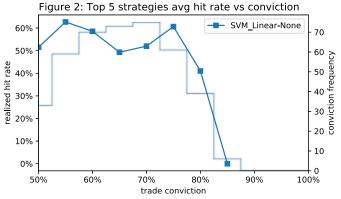
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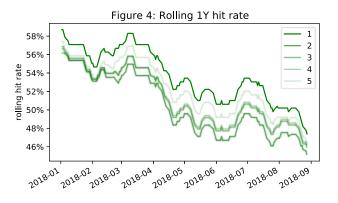
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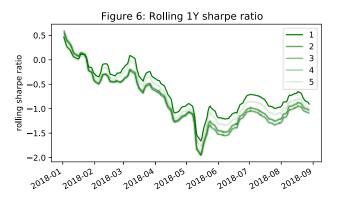
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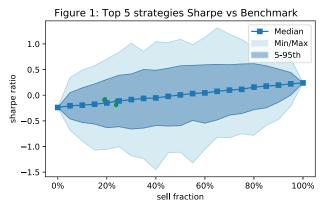


Note: Figure 6 presents top 5 strategies' rolling 1 year Sharpe ratio (unitless) over Quarantine.

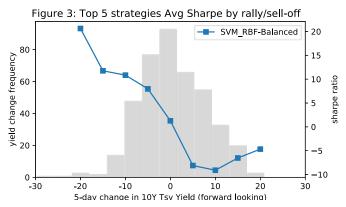
Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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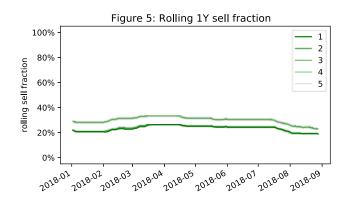
10Y Treasuries: Top 5 SVM-RBF-Balanced performance measurement



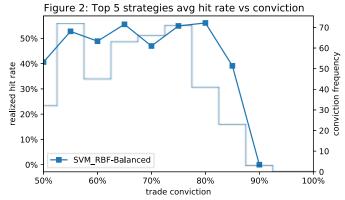
Note: Figure 1 compares top 5 strategies' Sharpe ratio (unitless) presented as green dots with percentiles of random trading decisions' Sharpe over Quarantine. Percentiles come from 1000 trials randomly permuting daily trading decisions at a fixed percentage of sell days (sell fraction) and then calculating sharpe ratio for each trial



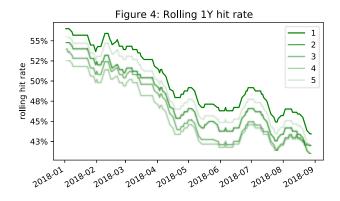
Note: Figure 3 presents average of top 5 strategies' Sharpe ratio (RHS; unitless) broken out by yield change (x-axis; bps) over Quarantine. Overlaid is the frequency of 5-day yield moves (LHS; counts).



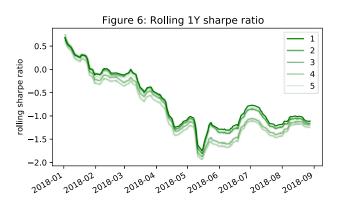
Note: Figure 5 presents top 5 strategies' rolling 1 year sell fraction (%) over Quarantine.



Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.

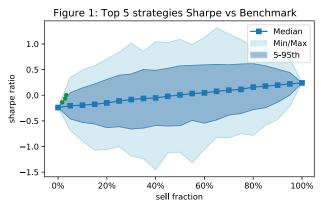


Note: Figure 6 presents top 5 strategies' rolling 1 year Sharpe ratio (unitless) over Quarantine.

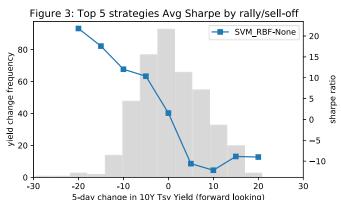
Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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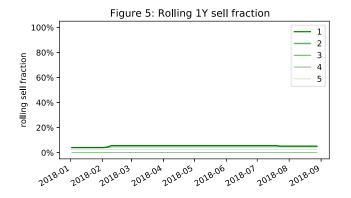
10Y Treasuries: Top 5 SVM-RBF-None performance measurement



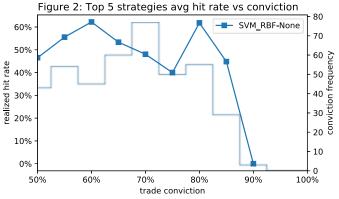
Note: Figure 1 compares top 5 strategies' Sharpe ratio (unitless) presented as green dots with percentiles of random trading decisions' Sharpe over Quarantine. Percentiles come from 1000 trials randomly permuting daily trading decisions at a fixed percentage of sell days (sell fraction) and then calculating sharpe ratio for each trial



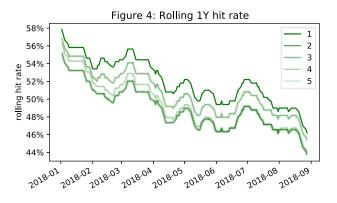
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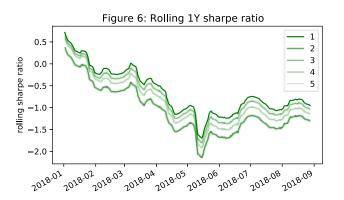
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Note: Figure 2 presents top 5 strategies' average hit rate by different conviction/confidence level over Quarantine. Hit rate (LHS; %) is broken out by the classifier's confidence (x-axis; %) in the signal at trade inception; It also provides the distribution of trading days by confidence within each group (RHS; counts).



Note: Figure 4 presents top 5 strategies' rolling 1 year hit rate (%) over Quarantine.



Note: Figure 6 presents top 5 strategies' rolling 1 year Sharpe ratio (unitless) over Quarantine.

J.P. Morgan Fixed Income Quantitative and Systematic Strategies

Joshua Younger (AC) (1-212) 270-1323 joshua.d.younger@jpmorgan.com Munier Salem (1-212) 270-0317 munier.salem@jpmorgan.com Jimmy (Guanjie) Huang (1-212) 834-2096 guanjie.huang@jpmorgan.com

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