
Follow the Leader

Time-lag series analysis to
discover leaders in S&P 500

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Outline

- Lagged Correlation
- Leadership Discovery
- S&P 500 Historical Leaders
- Leadership Index Application

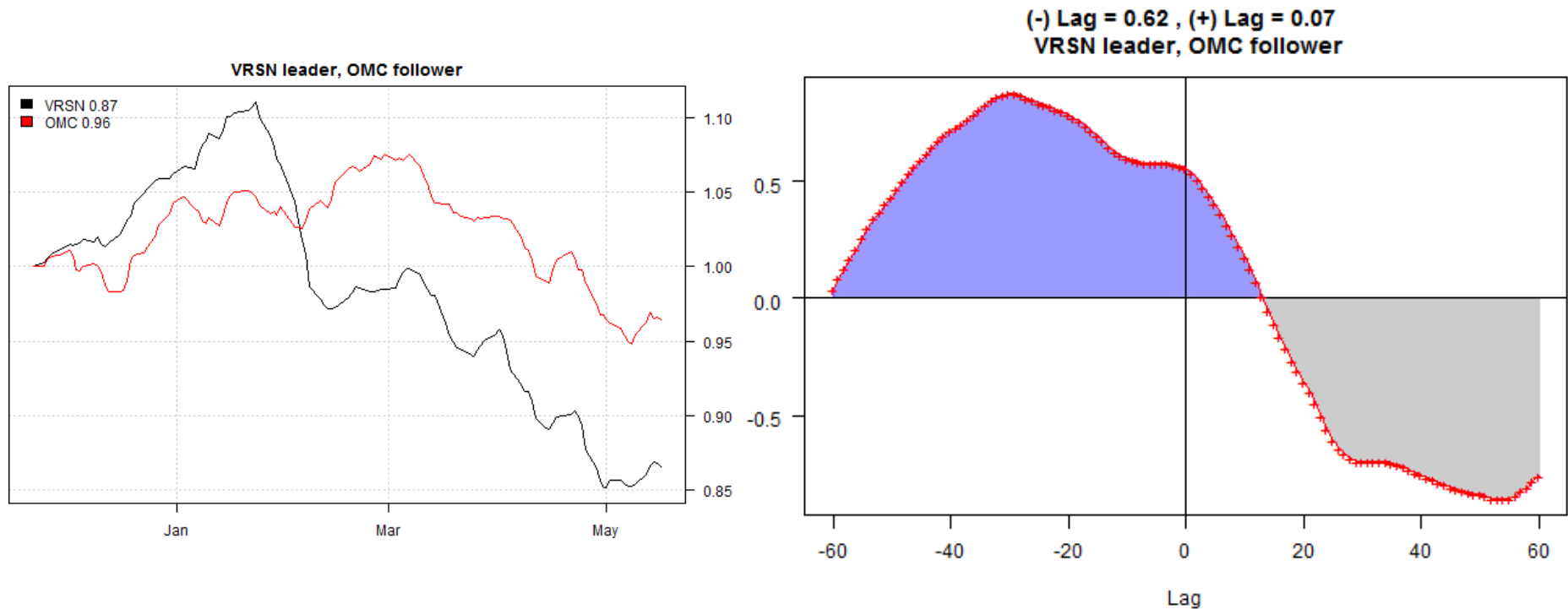
Lagged Correlation

■ Two Time Series and Lagged Correlation

Lag 0	<table border="1"><tr><td>X1</td><td>X2</td><td>X3</td><td>X4</td><td>X5</td></tr><tr><td>Y1</td><td>Y2</td><td>Y3</td><td>Y4</td><td>Y5</td></tr></table>	X1	X2	X3	X4	X5	Y1	Y2	Y3	Y4	Y5	
X1	X2	X3	X4	X5								
Y1	Y2	Y3	Y4	Y5								
Lag 1	X1	<table border="1"><tr><td>X2</td><td>X3</td><td>X4</td><td>X5</td></tr><tr><td>Y1</td><td>Y2</td><td>Y3</td><td>Y4</td></tr></table>	X2	X3	X4	X5	Y1	Y2	Y3	Y4	Y lead, X follow	
X2	X3	X4	X5									
Y1	Y2	Y3	Y4									
Lag 2	X1	X2	<table border="1"><tr><td>X3</td><td>X4</td><td>X5</td></tr><tr><td>Y1</td><td>Y2</td><td>Y3</td></tr></table>	X3	X4	X5	Y1	Y2	Y3	Y lead, X follow		
X3	X4	X5										
Y1	Y2	Y3										
Lag -1		<table border="1"><tr><td>X1</td><td>X2</td><td>X3</td><td>X4</td></tr><tr><td>Y1</td><td>Y2</td><td>Y3</td><td>Y4</td></tr></table>	X1	X2	X3	X4	Y1	Y2	Y3	Y4	X lead, Y follow	
X1	X2	X3	X4									
Y1	Y2	Y3	Y4									
Lag -2			<table border="1"><tr><td>X1</td><td>X2</td><td>X3</td></tr><tr><td>Y1</td><td>Y2</td><td>Y3</td></tr></table>	X1	X2	X3	Y1	Y2	Y3	X lead, Y follow		
X1	X2	X3										
Y1	Y2	Y3										

Lagged Correlation

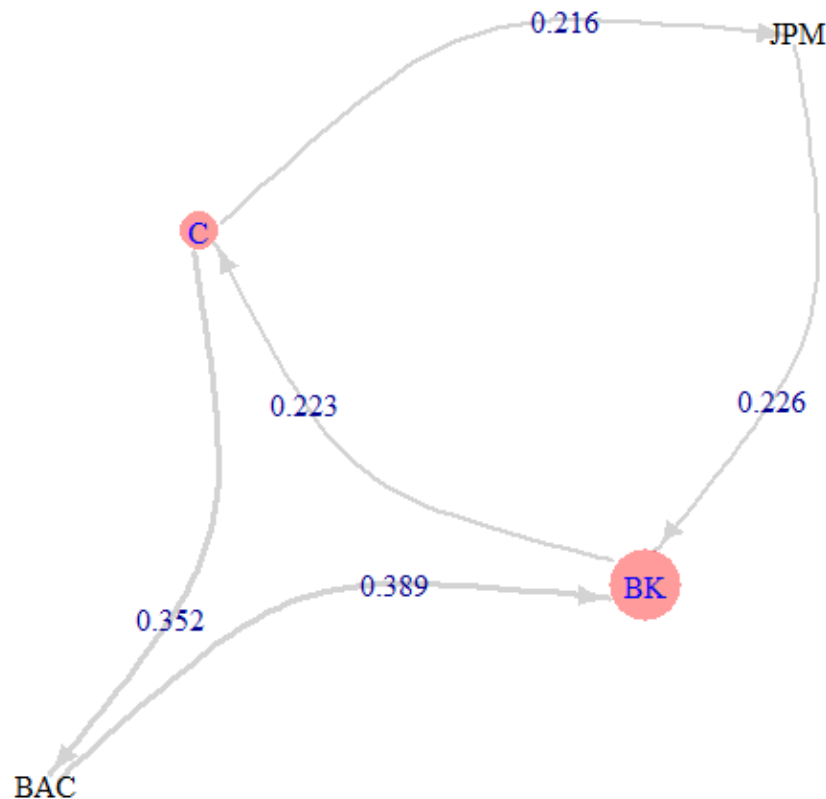
■ Two Time Series and Lagged Correlation



Most examples are NOT that well synchronized

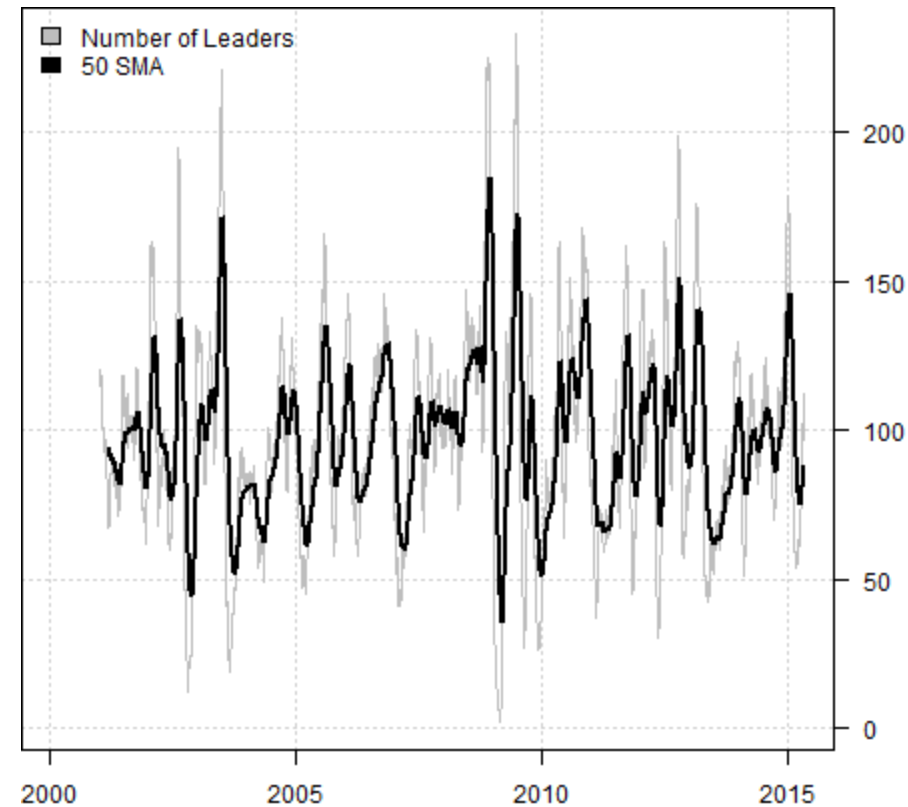
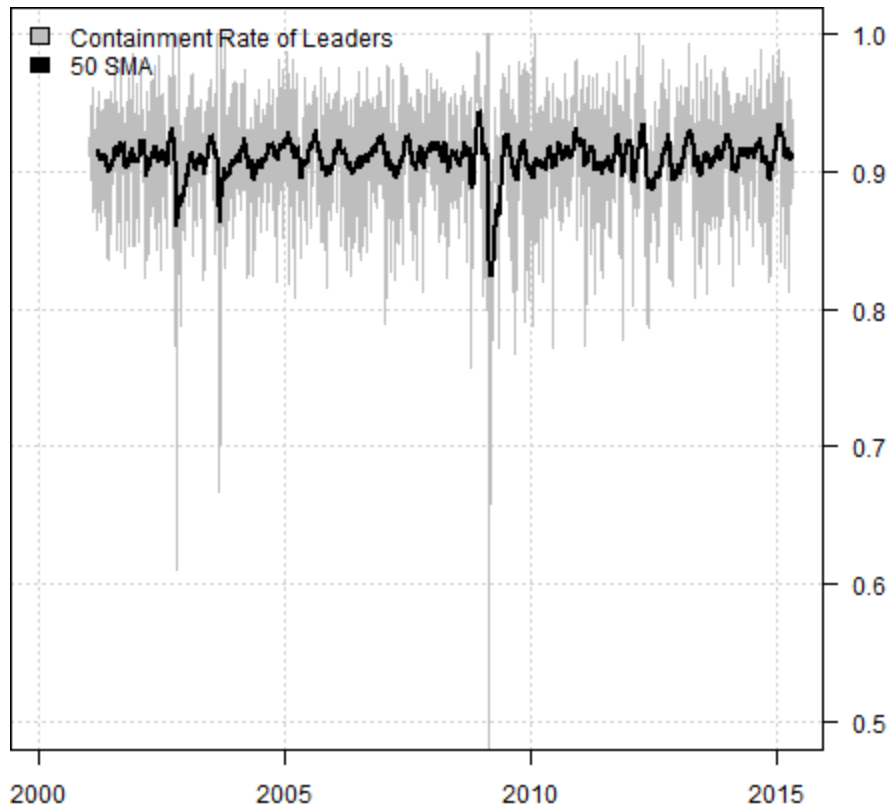
Leadership Discovery

Directed, weighted by lagged correlations,
Graph. Extract leaders using PageRank score.



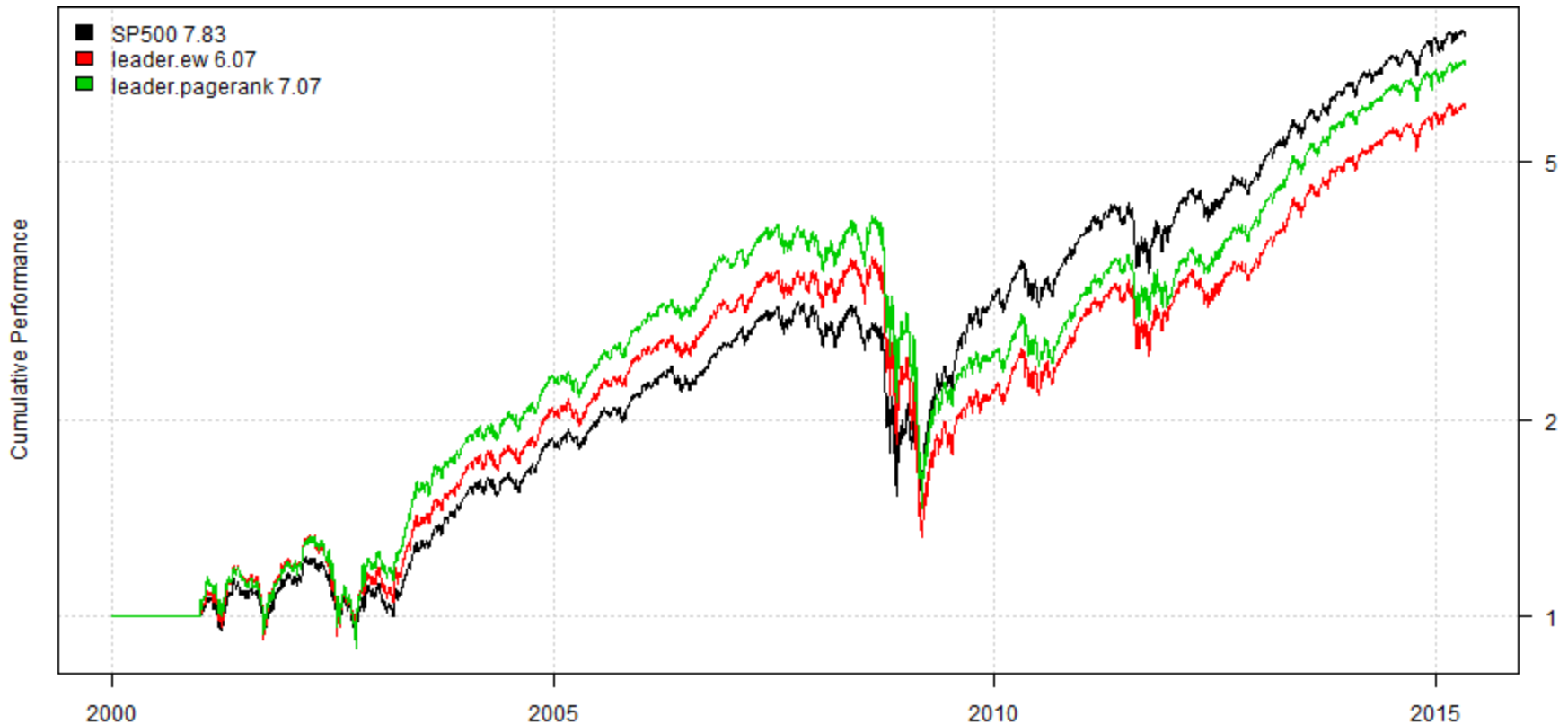
S&P 500 Historical Leaders

- Number of leaders and historical transition of leaders discovered in S&P 500



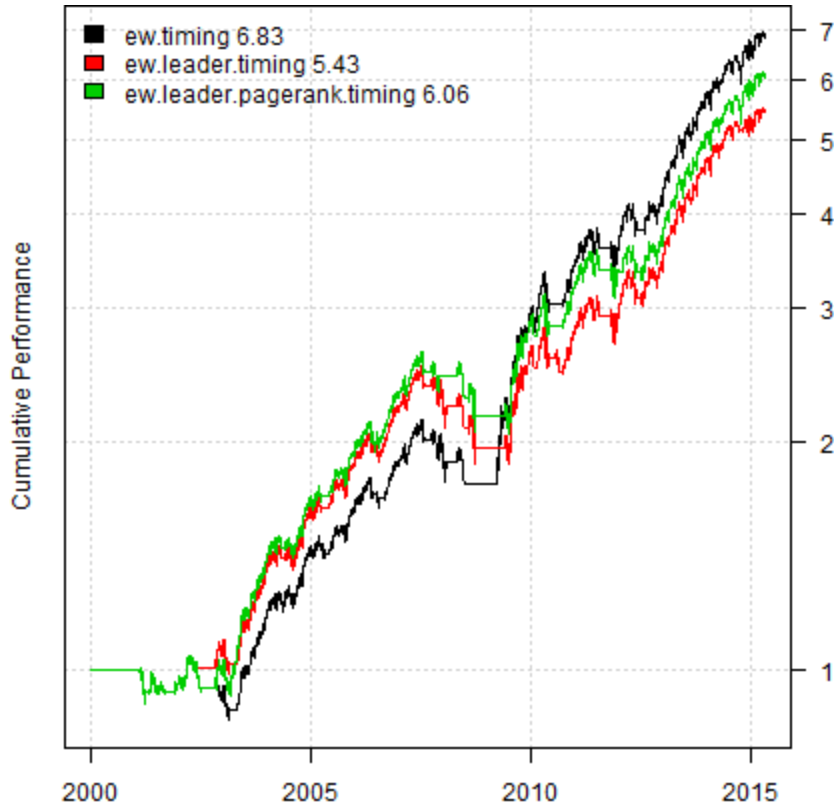
Leadership Index

- Construct index from selected leaders weighted equally and proportionate to score



Timing with Leadership Index

- Buy S&P 500 when above 100 SMA



System	ew.timing	ew.leader.timing	ew.leader.pagerank.timing
Period	Jan2000 - Apr2015	Jan2000 - Apr2015	Jan2000 - Apr2015
Cagr	13.35	11.67	12.46
Sharpe	1.07	0.95	1
DVR	0.9	0.83	0.89
R2	0.84	0.87	0.89
Volatility	12.46	12.5	12.57
MaxDD	-17.54	-26.07	-22.07
Exposure	72.68	72.27	72.89

Lagged Correlation in Rcpp Parallel

- For Each Pair in SP500 =
 $500 * 499 / 2 = 124,750$
- 120 look back window =
(+)60 lag and (-)60 lag = 120 correlation
- 10 year = $10 * 252 = 2,520$

$$124,750 * 120 * 2,520 = 37,724,400,000$$

The End

Please visit my blog at

systematicinvestor.github.io

for more examples and ideas.

References

Download R Code at systematicinvestor.github.io/rfinance2015

- Detecting Leaders from Correlated Time Series
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- Time-lag Method for Detecting Following and Leadership Behavior of Pedestrians from Mobile Sensing Data, 2013
by M. Kjargaard, H. Blunck, M. Wustenberg, Kaj Gronbak, M. Wirz, D. Roggen, G. Troster
- Discovering Shakers from Evolving Entities via Cascading Graph Inference
by X. Shiy, W. Fanz, J. Zhang, P. Yuy