



Using Credit Information in Equity Markets: Application to European Markets, High Frequency Trading and Earning Announcements

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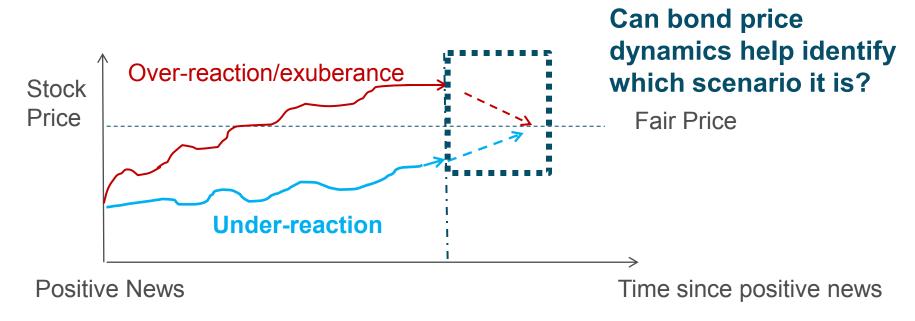
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Why would Bond Price Dynamics Improve Equity Momentum?

Momentum may reflect investors' under-reaction to news (Shleifer and Vishny 1998), or overreaction driven by investor behavioral biases



- ❖ Bond returns may help identify which trajectory is more likely in the example above (eg, equity momentum may be more likely to mean-revert when observing contradicting bond price dynamics)
- ❖ Ben Dor and Xu (2014) showed that equities with higher past bond returns also have higher future equity returns (BEAM - Bonds in Equity Asset Momentum)



Key Features of BEAM

| | Description |
|--|--|
| I. Signal Dynamics | Past three months, inclusion of most recent month |
| II. Role of Industry-level Momentum | Industry-neutral BEAM retained its strong performance |
| III. Return Dynamics | Steady performance even during market reversals unlike equity momentum |
| IV. Volatility | BEAM L-S portfolio had consistently lower vol than equity momentum |
| V. Hedging Efficacy | BEAM L and S portfolios exhibit similar characteristics |
| VI. Performance by market states | BEAM L-S portfolios consistently outperformed equity momentum in different fixed market conditions |



BEAM Performance Update



BEAM Outperformance Persisted Following the 2014 Publication

- BEAM strategy continued to outperform equity momentum portfolios (EMP) following the results in Ben Dor and Xu (2014)*, delivering
 - √ Higher performance (absolute return and information ratio)
 - √ Lower risk (vol. and tail measures)
- √ BEAM strategy also delivered better performance than a number of equity factors

Performance of BEAM vs. Equity Momentum Portfolio (EMP) (EW, Top – Bottom Decile, Jan. 2014 – Feb. 2018 based on availability of FF factors)

| | BEAM Universe | | | Fama-French Factors | | | | |
|-----------------------|---------------|--------|----------|---------------------|--------|---------------|------------|--|
| | BEAM | EMP | Momentum | Value | Size | Profitability | Investment | |
| Avg Ret (%/Yr) | 14.48 | 9.42 | 8.61 | 1.05 | 7.11 | 3.43 | 3.13 | |
| Vol. (%/Yr) | 11.80 | 19.77 | 17.41 | 11.50 | 10.81 | 12.84 | 9.39 | |
| Inf. Ratio | 1.23 | 0.48 | 0.49 | 0.09 | 0.66 | 0.27 | 0.33 | |
| Worst Month Ret (%/m) | -5.40 | -14.86 | -12.02 | -6.97 | -7.77 | -12.19 | -5.62 | |
| Max Drawdown (%) | -9.10 | -30.00 | -25.15 | -20.75 | -11.04 | -13.09 | -15.22 | |

Note: BEAM and EMP portfolios are sorted within industry for the universe of equities with outstanding index bonds. The Fama-French factor are sorted across the CRSP universe. Factor returns and definitions are available on Ken French's web site.

Source: Compustat, Ken French Data Library, Barclays Research

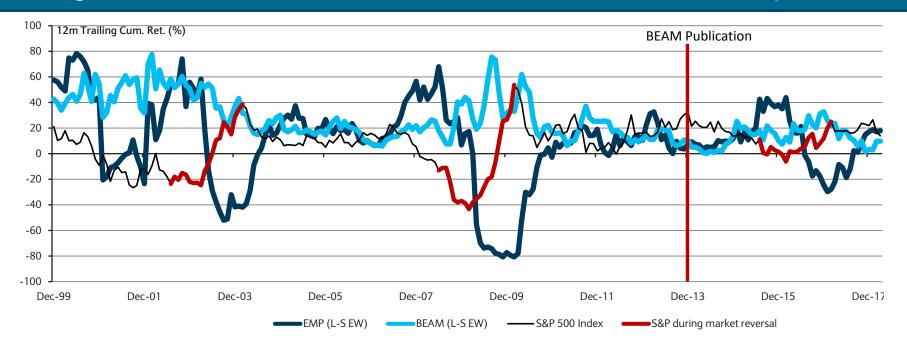
^{*:}Ben Dor, A. and Xu, Z. 2014. BEAM (Bonds in Equity Asset Momentum): Value of Bond Market Information in Equity Momentum Strategies. Barclays live. A shorter version is also published in JPM: Ben Dor, A. and Xu, Z., 2015. Should Equity Investors Care about Corporate Bond Prices? Using Bond Prices to Construct Equity Momentum Strategies. *Journal of Portfolio Management*, 41(4), p.35.



BEAM Behavior during Market Reversal Was Consistent with Our Original Findings

 BEAM return dynamics during a market reversal in the post-publication period were consistent with earlier results

Trailing 12m Cumulative Performance of BEAM and EMP Portfolios (within ind, EW)



Source: Compustat, Barclays Research



Today's Presentation:

Additional Application of Credit Information to Equity Markets

BEAM for European Markets

D-BEAM:

Using Daily
Corporate Bond
Prices in HighFrequency Equity
Momentum
Strategies

Using Credit Information to improve PEAD Strategies

BEAM for European Markets

Link to Full Report



Are European BEAM main findings consistent with U.S. BEAM?

| | Key Features in U.S. | Same features in Europe |
|---|--|-------------------------|
| I. Signal Dynamics | Past three months, inclusion of most recent month | |
| II. Role of Industry- level Momentum | Industry-neutral BEAM retained its strong performance | |
| III. Return Dynamics | Steady performance even during market reversals unlike equity momentum | |
| IV. Volatility | BEAM L-S portfolio had consistently lower vol than equity momentum | |
| V. Hedging Efficacy | BEAM <i>L</i> and <i>S</i> portfolios exhibit similar characteristics | |
| VI. Performance by market states | BEAM L-S portfolios consistently outperformed equity momentum in different fixed market conditions | |



I. Same Optimal Ranking Window in European Markets

| Performance of Bond-ranked Momentum Portfolios by Ranking Period (Top-Bottom Decile) | | | | | | | | | |
|---|--------------------------|-------|--------------|------------|---------|-------|-------|-------|-------|
| | | | U.S. (Origin | al Paper) | | | Euro | oe . | |
| Ranking | g Window (Past k months) | k=3 | 6 | 9 | 12 | k=3 | 6 | 9 | 12 |
| | | | Panel A: Exc | luding Mon | nth t-1 | | | | |
| | Avg (%/Yr) | 7.87 | 5.37 | 6.05 | 7.65 | 5.48 | 3.71 | 3.39 | 4.74 |
| VW | Vol. (%/Yr) | 21.24 | 18.98 | 19.28 | 20.78 | 17.14 | 19.98 | 18.38 | 19.50 |
| | Inf. Ratio (Ann.) | 0.37 | 0.28 | 0.31 | 0.37 | 0.32 | 0.19 | 0.18 | 0.24 |
| | Avg (%/Yr) | 12.21 | 12.90 | 7.57 | 6.18 | 7.64 | 7.07 | 5.38 | 6.94 |
| EW | Vol. (%/Yr) | 15.40 | 18.09 | 18.39 | 19.68 | 12.81 | 16.67 | 15.98 | 16.64 |
| | Inf. Ratio (Ann.) | 0.79 | 0.71 | 0.41 | 0.31 | 0.60 | 0.42 | 0.34 | 0.42 |
| | · | | Panel B: Inc | luding Mon | th t-1 | | 1 | | |
| | Avg (%/Yr) | 14.50 | 10.52 | 13.47 | 10.89 | 10.58 | 6.20 | 4.89 | 6.97 |
| VW | Vol. (%/Yr) | 22.11 | 19.16 | 20.86 | 21.20 | 18.70 | 20.38 | 19.17 | 20.13 |
| | Inf. Ratio (Ann.) | 0.66 | 0.55 | 0.65 | 0.51 | 0.57 | 0.30 | 0.25 | 0.35 |
| | Avg (%/Yr) | 17.38 | 15.69 | 12.09 | 9.75 | 11.40 | 11.03 | 5.81 | 7.72 |
| EW | Vol. (%/Yr) | 14.97 | 17.13 | 18.09 | 20.09 | 15.36 | 17.40 | 17.20 | 17.71 |
| | Inf. Ratio (Ann.) | 1.16 | 0.92 | 0.67 | 0.49 | 0.74 | 0.63 | 0.34 | 0.44 |

Note: the U.S. results are from Ben Dor and Xu (2014), based on returns from Jan. 1994 – Dec. 2013. The European results are based on returns from May 2003 – Dec. 2017. Source: Compustat, Barclays Research

✓ Same shorter window works best for bond market signals in Europe

| | Bond Market Signal (BEAM) | Same in Europe |
|-------------------|---------------------------|----------------|
| Window Length | Shorter (3m) | $\sqrt{}$ |
| Most Recent Month | Inclusion | \checkmark |

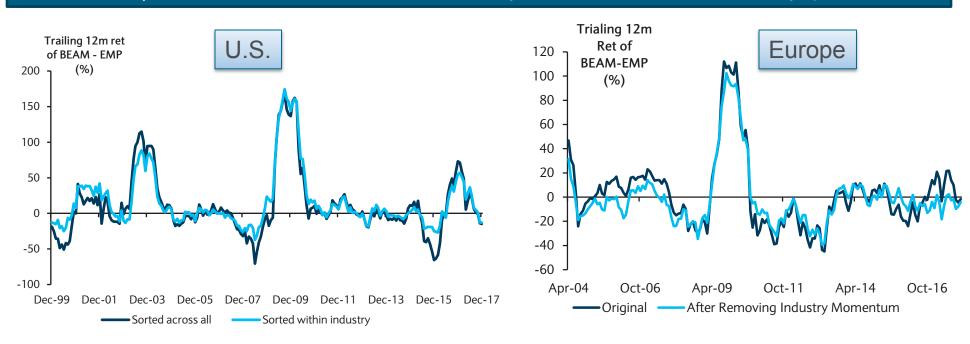
✓ In addition, BEAM outperformed EMP (information ratio of 0.74 vs. 0.26)



II. Industry Momentum did not drive BEAM Outperf. in US or Europe

- Controlling for industry-level momentum in the US increased BEAM outperformance over EMP
- $\sqrt{\ }$ In Europe, removing industry momentum, led to similar returns, lower volatility and slightly higher I.R. for BEAM, indicating the strategy performance was *not* driven by sector effect

Trailing 12m Outperformance of BEAM over EMP (EW, Jan.1999 – Dec. 2017 for U.S., Apr. 2004 – Dec. 2017 for Europe)



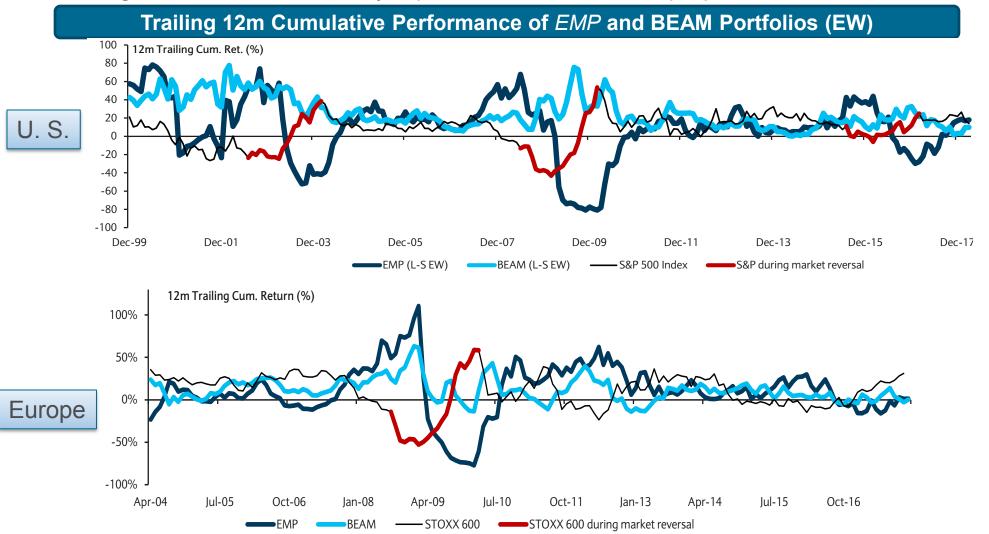
Note: U.S. BEAM and EMP constituents were ranked within fixed income and GICS sectors respectively. In Europe, industry level-effects are removed by standardizing signals using contemporaneous sector returns because of the smaller sample size.

Source: Compustat, Barclays Research



III. BEAM and EMP Exhibited Different Dynamics in Market Reversals

- BEAM outperforms in volatile periods, when market rebounds swiftly from a trough in US (2003, 2009) and Europe (2009)
- Trailing 12m returns of BEAM stayed positive in most of the sample period in both markets

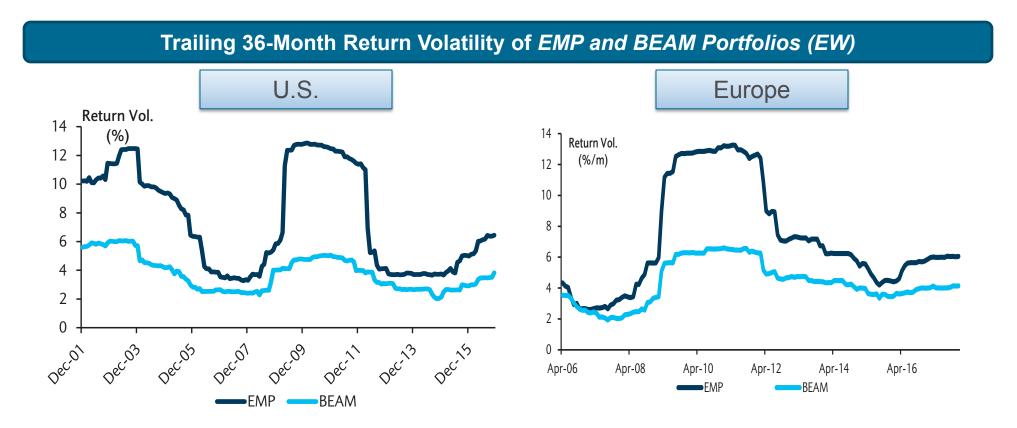


Note: the U.S. BEAM and EMP are sorted within industry. BEAM and EMP in European markets are sorted across all. Source: Kenneth French Data Library, Bloomberg, Barclays Research



IV. BEAM Volatility Is Consistently Lower than EMP's

 BEAM strategy exhibited consistently lower volatility than EMP (despite shorter ranking window)



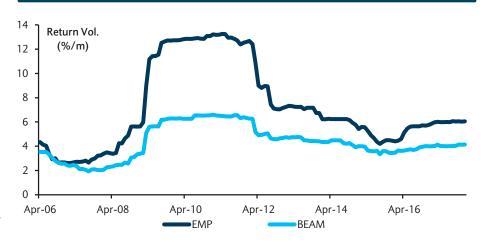
Note: In the US, stocks were sorted within industries and returns are from Jan. 1999 – Dec. 2016. In Europe, the returns are from May 2003 to Dec. 2017. The industry components were not removed in Europe. Source: Compustat, Barclays Research

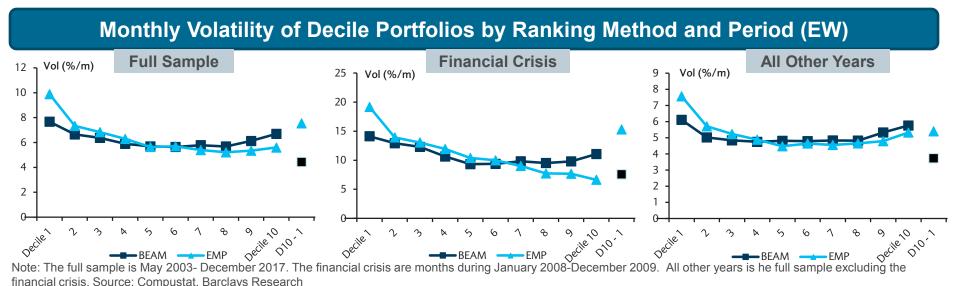


Bond-Based Deciles Have Similar Vol. Unlike Equity Based Deciles

- The vol. of BEAM decile 10 ('winners') is higher than the corresponding EMP decile, while the reverse is true for decile 1. BEAM deciles vol. is also more uniform
- Combining BEAM L and S legs lowers vol. due to better hedging unlike for EMP
- During the Crisis, stocks in BEAM L and S legs had similar characteristics -> higher correlation and more balanced volatilities of the two decile portfolios-> better hedging

Trailing 36m Return Volatility of EMP and BEAM Portfolios (EW, 4/2006 – 12/2017)







V. BEAM L and S Legs in Europe Exhibit Similar Characteristics

- BEAM *L* and *S* port. betas showed little difference over time
- During the Financial Crisis, the beta of the EMP S leg was much higher than the L leg, contributing to large losses
- The credit rating of BEAM *L* leg is worse than that of BEAM *S* leg
- BEAM portfolio is also tilted toward smaller firms
- BEAM winners and losers have smaller diff. in leverage and beta than EMP
- US BEAM L and S legs also exhibit similar characteristics

European Stock Characteristics of EMP and BEAM Portfolio by Time Period (EW, May 2003 – Dec. 2017)

| I ditione by finite | Ollo G | | may Ev | | CUI ZU | ••/ |
|---|--------|---------|--------------------|----------------|---------|----------------|
| | | EMP | | | BEAM | |
| | Losers | Winners | Winners-Losers | Losers | Winners | Winners-Losers |
| | | | Full Sample, 5/2 | 2003 - 12/2017 | | |
| Ratings | 4.13 | 4.08 | -0.05 | 3.86 | 4.66 | 0.79 |
| Book-to-Market Ratio | 0.97 | 0.65 | -0.32 | 0.70 | 0.86 | 0.16 |
| Leverage (BV of Debt/(Debt+Equity Market Cap.)) | 55% | 34% | -20% | 41% | 42% | 1% |
| Market Cap (\$Bn) | 5.16 | 9.68 | 4.53 | 10.04 | 5.34 | -4.70 |
| Beta to STOXX 600 | 1.23 | 1.16 | -0.07 | 1.04 | 1.24 | 0.20 |
| | | | Financial Crisis 1 | /2008-12/2009 | | |
| Ratings | 3.85 | 3.62 | -0.24 | 3.72 | 4.00 | 0.28 |
| Book-to-Market Ratio | 1.18 | 0.56 | -0.61 | 0.80 | 0.89 | 0.08 |
| Leverage (BV of Debt/(Debt+Equity Market Cap.)) | 72% | 30% | -42% | 52% | 44% | -8% |
| Market Cap (\$Bn) | 3.48 | 14.67 | 11.19 | 6.94 | 8.07 | 1.13 |
| Beta to STOXX 600 | 1.39 | 0.86 | -0.53 | 1.04 | 1.17 | 0.13 |
| | | | All Other Sa | mple Years | | |
| Ratings | 4.17 | 4.15 | -0.02 | 3.89 | 4.76 | 0.87 |
| Book-to-Market Ratio | 0.94 | 0.67 | -0.27 | 0.68 | 0.85 | 0.17 |
| Leverage (BV of Debt/(Debt+Equity Market Cap.)) | 52% | 35% | -17% | 39% | 42% | 3% |
| Market Cap (\$Bn) | 5.42 | 8.89 | 3.47 | 10.53 | 4.91 | -5.63 |
| Beta to STOXX 600 | 1.21 | 1.21 | 0.00 | 1.04 | 1.26 | 0.21 |

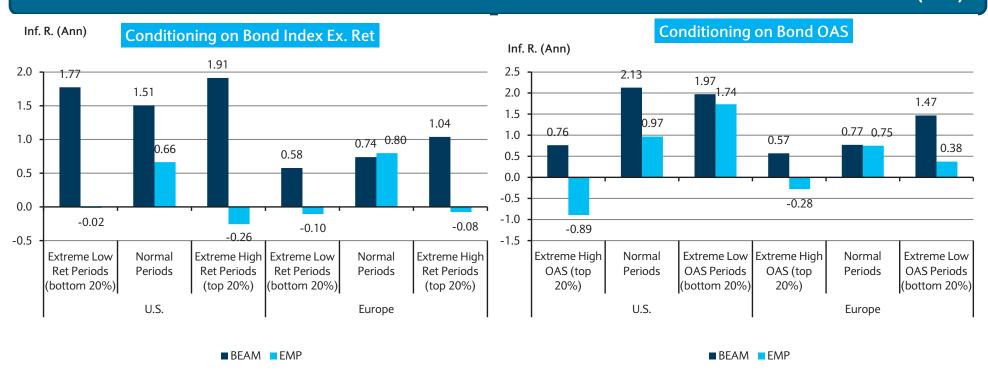
Note: Outstanding bonds ratings are converted to a numeric scale, and then aggregated by market values to produce a firm's rating. The conversion scale is: AAA=1,AA=2,A=3,BAA=4,BA=5,B=6,CAA=7,CA=8,C=8,D=9: the better the rating the lower the value. Source: Bloomberg, Compustat, Barclays Research



BEAM Outperformed EMP following Extreme FI Market States

- Conditional on the previous month's fixed income market conditions (excess return or OAS), BEAM outperformed EMP even more when
 - FI market had extremely high or low returns, regardless of the direction
 - OAS were at extremely high levels

Information Ratio of BEAM and EMP Conditional on FI market State in Previous Month (EW)



Note: In the US, BEAM and EMP were sorted within industries from Jan. 1999 – Mar. 2018. For Europe, BEAM and EMP were not adjusted for industry momentum, and returns are from May 2003 – Mar. 2018. Source: Compustat, Barclays Research



European BEAM main findings are consistent with U.S. BEAM

| | Key Features in U.S. | Same features in Europe? |
|--|--|--------------------------|
| I. Signal Dynamics | Past three months, inclusion of most recent month | √ |
| II. Role of Industry Momentum | Industry-neutral BEAM retained its strong performance | • |
| III. Return Dynamics | Steady performance even during market reversals unlike equity momentum | √ |
| IV. Volatility | BEAM L-S portfolio had consistently lower vol than equity momentum | √ |
| V. Hedging Efficacy | BEAM L and S portfolios exhibit similar characteristics | ✓ |
| VI. Persistent Performance by market state | BEAM L-S portfolios consistently outperformed equity momentum in different fixed market conditions | ✓ |



D-BEAM

Using Daily Corporate Bond Prices in High-Frequency Equity Momentum Strategies

Link to Full Report



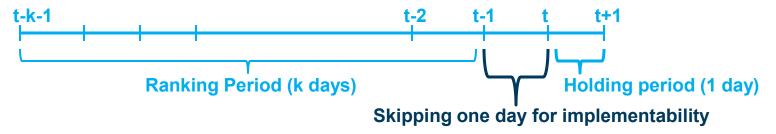
Differences in Monthly and Daily Bond Return Signals

- Signal Existence?
 - Equity price dynamics switch from momentum at a medium horizon to 'short-term reversal' (ST Rev.) at a daily frequency
 - Does BEAM strategy reverse at daily frequency?
 - Or do the same BEAM patterns persist from monthly to daily?
- Corporate bonds are relatively illiquid compared with the equity market and may not incorporate new information into their prices on a daily basis
- The cross-sectional dispersion in price movements at a higher frequency is more limited and requires higher accuracy from the signal in order to identify cross-sectional variation



Momentum: Portfolio Construction

■ At the end of each day, we form 10 equity momentum portfolios on the basis of prior (t-k-1,t-1) bond excess returns:



- Over the one-day holding period, we evaluate the return of the top and bottom ("winner" and "loser") deciles. We also consider the long-short portfolio that invests \$1 in the winner portfolio and shorts \$1 of the loser portfolio
- Weighting scheme: Equal Weighted (EW) or Value Weighted (VW), with a 2% cap on any individual company



Bond and Equity-Based Momentum Perf. by Ranking Window

- Note: Given the short-run mean reversion in equity markets, the comparable equity strategy is based on buying losers and selling winners (Short-term Reversal)
- All bond-based signals are superior (higher return and lower vol) to the portfolios based on equity signals
- Improved performance from ranking within industries reflects lower vol, rather than higher return
- Unlike equity, bond-ranked signals do not display short-term reversal

Bond- and Equity-Ranked Mom. Performance by Ranking Period (top-bottom or bottom-top deciles, Jan. 2001 – Dec. 2017)

| | | Вс | ond-ranke | d Momenti | ım Portfol | io | | Shor | t-term Rev | ersal | |
|----------------------------------|----------------------|---------|-----------|--------------|--------------|-----------|---------|------------|------------|-------------|---------|
| | | Buy Wir | ners and | Selling Los | ers: Top - | Bottom | Buy Los | ers and Se | lling Winr | iers: Botto | m - Top |
| anking | Window (Past k days) | k=1 | 3 | 5 | 9 | 20 | k=1 | 3 | 5 | 9 | 20 |
| Panel A: Ranking Across Universe | | | | | | | | | | | |
| | Avg (%/Yr) | 13.2 | 15.6 | 15.9 | 16.6 | 20.5 | 3.4 | 9.2 | 5.4 | 2.0 | -1.0 |
| EW | Vol. (%/Yr) | 11.7 | 13.4 | 14.5 | 15.8 | 17.7 | 20.7 | 22.2 | 23.2 | 23.4 | 24.0 |
| | Inf. Ratio (Ann.) | 1.13 | 1.17 | 1.09 | 1.05 | 1.16 | 0.16 | 0.41 | 0.24 | 0.09 | -0.04 |
| | Avg (%/Yr) | 8.8 | 8.0 | 7.6 | 8.5 | 11.5 | 9.1 | 16.6 | 15.0 | 7.8 | 4.5 |
| VW | Vol. (%/Yr) | 11.5 | 13.5 | 14.6 | 15.6 | 17.4 | 21.4 | 22.8 | 23.9 | 24.3 | 25.1 |
| | Inf. Ratio (Ann.) | 0.80 | 0.60 | 0.50 | 0.50 | 0.70 | 0.40 | 0.70 | 0.60 | 0.30 | 0.20 |
| | · | , | Pa | nel B: Ranki | ng Within Ir | ndustries | | | | | |
| | Avg (%/Yr) | 12.7 | 18.2 | 17.1 | 15.6 | 18.0 | 4.5 | 9.8 | 7.3 | 5.2 | 3.0 |
| EW | Vol. (%/Yr) | 9.1 | 9.9 | 10.4 | 10.9 | 11.9 | 14.4 | 15.8 | 16.8 | 16.7 | 17.7 |
| | Inf. Ratio (Ann.) | 1.39 | 1.83 | 1.65 | 1.43 | 1.52 | 0.31 | 0.62 | 0.44 | 0.31 | 0.17 |
| | Avg (%/Yr) | 8.90 | 10.5 | 9.8 | 8.0 | 9.6 | 7.9 | 13.5 | 12.7 | 8.5 | 6.5 |
| VW | Vol. (%/Yr) | 8.90 | 9.7 | 10.1 | 10.6 | 11.3 | 14.2 | 15.6 | 16.4 | 16.3 | 17.5 |
| | Inf. Ratio (Ann.) | 1.00 | 1.10 | .00 | 0.80 | 0.90 | 0.60 | 0.90 | 0.80 | 0.50 | 0.40 |

Source: Compustat, Barclays Research

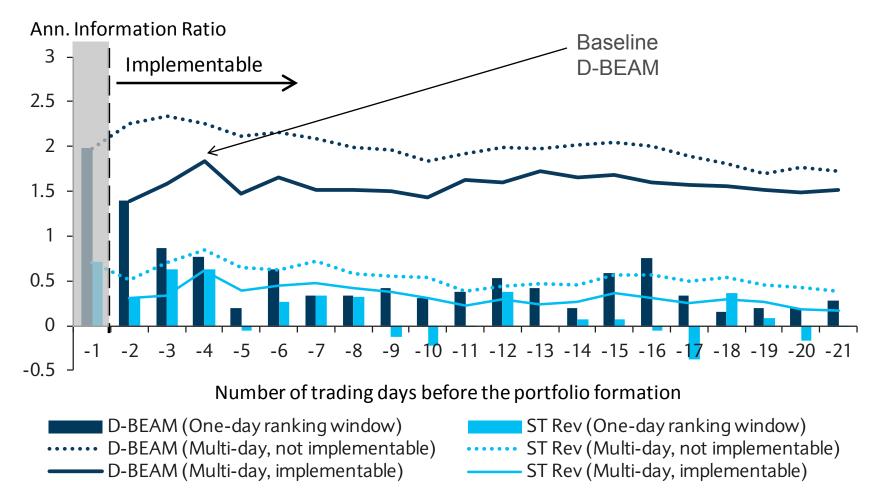
D-BEAM

Short-term Reversal



The Informational Content of Bond and Equity Signals by Ranking Window

L/S Portfolio performance by Signal and Construction Method (EW, Within Industries, top-bottom deciles, Jan. 2001 – Dec. 2017)



Source: Compustat, Barclays Research



The Informational Content of Bond and Equity Signals by Ranking Window: Key Findings

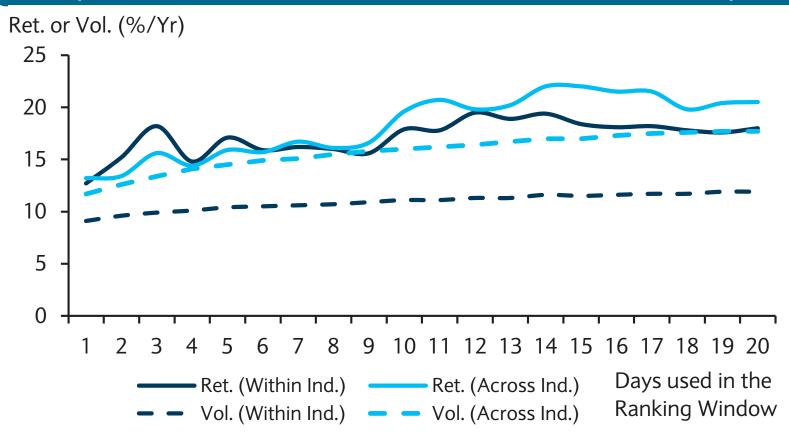
- Similar to monthly BEAM, the most recent period (day) is the most important
- The signal efficacy decays gradually
- Ranking windows based on multiple days are better than any single-day ranking window
- D-BEAM is based on a three-day ranking window immediately preceding the most recent day and generates an information ratio of 0.8



Ranking Within Industries Leads to Better Performance

 Ranking firms within industries results in similar average returns to ranking across industries, but with lower vol

Returns and Vol of Long-Short Daily EW Bond-Ranked Mom. (across and within Industries, Jan. 2001 – Dec. 2017)



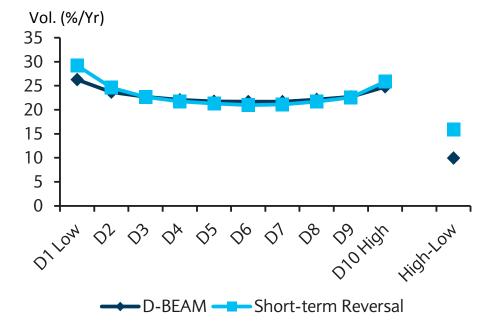
Source: Compustat, Barclays Research



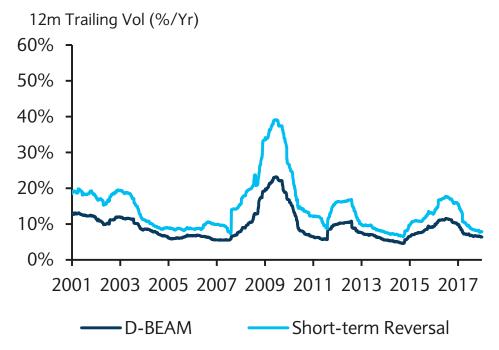
D-BEAM Volatility is Consistently Lower than ST Rev. Vol.

- The vol. of the decile portfolios is similar irrespective of the signal source
- However, D-BEAM vol. is about half that of the L/S ST REV port. not only on avg. but in each 36-month period
- D-BEAM consistent lower vol. reflects the tendency of the bond signal to generate long and short portfolios with similar factor exposures

D-BEAM and Short-term Rev. Vol. by Decile (EW, Within Industries, Jan. 2001 – Dec. 2017)



D-BEAM and Short-term Rev. 12-m Vol. of daily returns (EW, Within Industries, Jan. 2001 – Dec. 2017)



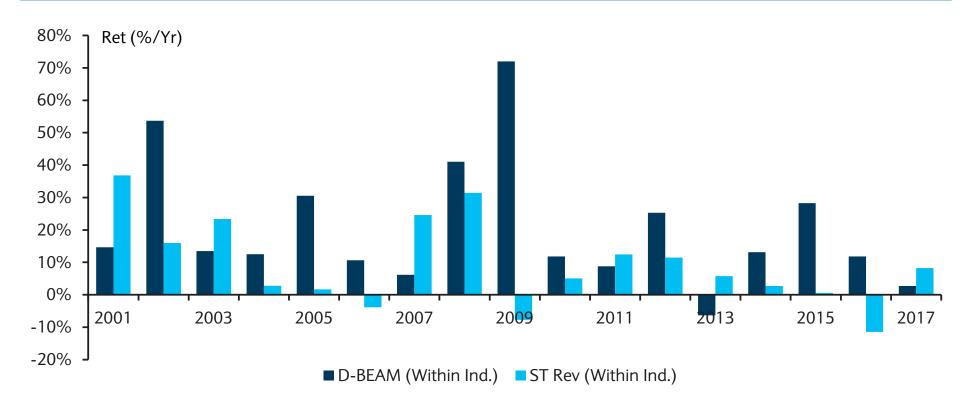
Note: D-BEAM is defined as D10-D1, whereas Short-term Reversal is defined as D1-D10. Source: Compustat, Barclays Research



D-BEAM Annual Returns Dynamics

■ D-BEAM avg. returns have been positive almost every year since 2001 (the only exception was in 2013)

D-BEAM and ST Rev Ret. (EW, Within Industries, Jan. 2001 - Dec. 2017)



Source: Compustat, Barclays Research

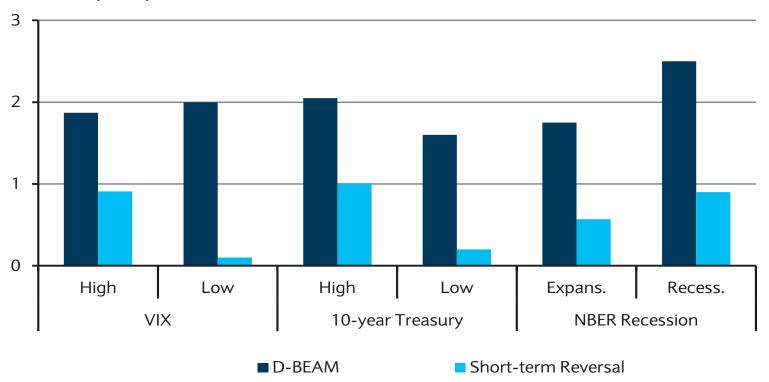


D-BEAM Inf. Ratio is higher than ST Rev Irrespective of Market State

■ BEAM information ratio is higher than ST Rev information ratio irrespective of market conditions

D-BEAM and ST Rev Return by Market state (EW, Within Industries, Jan. 2001 - Dec. 2017)

Inf. Ratio (ann.)



Note: The High (Low) level of VIX is above (below) its median (17.2% in the sample 2001-17). The High (Low) level of the 10-year Treasury rate is above (below) its median (3.47% in 2001-17). The recession and expansion are classified by the NBER. Source: Compustat, NBER, Barclays Research



D-BEAM Has Low Correlation with Daily Risk Factors

- D-BEAM factor has
 - Very low (level and rank) correlation with other existing factors
 - moderately positive correlation with equity momentum
 - negative correlation w/ short-term reversal
- Equity momentum has negative correlation w/ short-term reversal factor

Pair-wise Correlation of Daily Factor Returns (Top Triangle – Pearson/Level, Bottom Triangle: Spearman/Rank) (EW, Jan. 2001 - Dec. 2017)

| | Mkt - Rf | SMB | HML | СМА | RMW | мом | ST Rev | Daily ST Rev | D-BEAM |
|--------------------------------|----------|-------|-------|-------|-------|-------|--------|-----------------|--------|
| Mkt - Rf | | 0.16 | 0.19 | -0.20 | -0.43 | -0.40 | 0.30 | 0.19 | -0.14 |
| SMB | 0.27 | | 0.12 | 0.09 | -0.25 | 0.00 | 0.01 | 0.02 | 0.03 |
| HML | 0.05 | 0.06 | | 0.35 | -0.14 | -0.29 | 0.03 | 0.03 | -0.07 |
| CMA (Investment) | -0.08 | 0.07 | 0.39 | | 0.11 | 0.24 | -0.23 | -0.09 | 0.09 |
| RMW (Profitability) | -0.39 | -0.27 | -0.10 | -0.07 | | 0.38 | -0.18 | -0.13 | 0.10 |
| MOM (Monthly) | -0.17 | 0.06 | -0.09 | 0.08 | 0.25 | | -0.22 | -0.07 | 0.08 |
| Short-term Reversal | 0.14 | 0.01 | -0.03 | -0.08 | -0.09 | -0.14 | | 0.44 | -0.33 |
| Daily ST Rev (EW, Within Ind.) | 0.10 | 0.05 | 0.00 | -0.02 | -0.09 | -0.04 | 0.28 | | -0.37 |
| D-BEAM (EW, Within Ind.) | -0.03 | 0.05 | 0.00 | 0.05 | 0.00 | 0.05 | -0.18 | -0.25 | |

Note: The sample period is Jan. 2001 – Dec. 2017. The ranking window for D-BEAM and Daily ST Rev is 3 days. "Short-term Reversal" factor is based on 21-day ranking window. The level (Pearson) correlation is reported in the upper triangular matrix, the rank (Spearman) correlation is reported in the lower triangular matrix. Source: Compustat, Ken French data library, Barclays Research



D-BEAM Generated Significant Alpha Even after Controlling for Other Risk Factors

- D-BEAM Alpha was significant and economically meaningful (about 20% per year)
- ST Rev. generated lower Alpha that was only marginally significant

Alpha (%/y) of D-BEAM and ST Rev Portfolios (EW, Across and Within Industries, top-bottom deciles, Jan. 2001 – Dec. 2017)

| | Across i | ndustries | Within industries | | |
|----------------|----------|-----------|-------------------|--------|--|
| | D-BEAM | ST Rev | D-BEAM | ST Rev | |
| Raw returns | 15.6*** | 9.2* | 18.2*** | 9.8** | |
| CAPM | 16.4*** | 7.6 | 18.8*** | 8.5** | |
| FF3 | 16.1*** | 7.7 | 18.6*** | 8.6** | |
| FF3+Mom+ST_Rev | 20.9*** | -1.7 | 21.5*** | 2.1 | |
| FF5 | 15.5*** | 9.4* | 17.8*** | 9.8** | |

Note: The sample period is Jan. 2001 – Dec. 2017. The ranking window is three days. The superscripts ***, **, and * indicate statistical significance at the 1%, 5% and 10% level. Source: Compustat, Ken French data library, Barclays Research



D-BEAM Factor Loadings are Small

- D-BEAM did not exhibit significant loadings on the Fama-French risk factors
- Small negative loading on Equity Short-Term Reversal factor

Daily regression of D-BEAM on various risk factors (EW, Within Industries, top-bottom deciles, Jan. 2001 - Dec.2017)

| Intercept | 18.8*** | 18.6*** | 21.5*** | 17.8*** |
|---------------------|----------|----------|----------|---------|
| Mkt - Rf | -0.07*** | -0.07*** | -0.03 | -0.05** |
| SMB | | 0.07* | 0.06* | 0.07** |
| HML | | -0.05 | -0.06* | -0.08 |
| Mom | | | -0.02 | |
| Short-Term Rev. | | | -0.12*** | |
| CMA | | | | 0.15** |
| RMW | | | | 0.08* |
| Adj. R ² | 1.9% | 2.4% | 11.3% | 3.3% |

Note: The sample is Jan. 2001 - Dec. 2017. The ranking window is three days. The superscripts ***, **, and * indicate statistical significance at the 1%, 5% and 10% level.. Source: Compustat, Ken French data library, Barclays Research

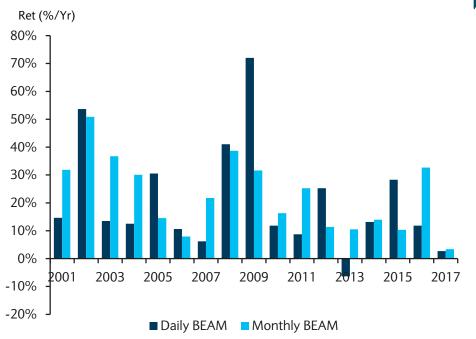


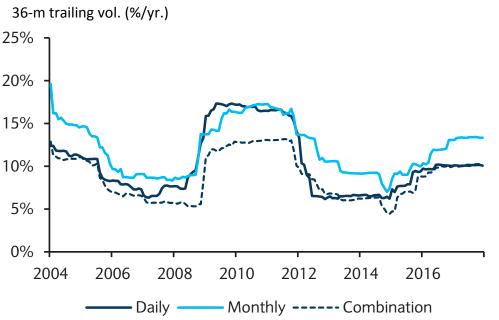
Combining Monthly and Daily BEAM Led to Lower Vol

- D-BEAM returns were high when monthly beam returns were low
- The correlation between daily and monthly BEAM (based on monthly returns) was 22%
- 36-month trailing vol. of the combined factor (half daily + half monthly) is usually lower than daily or monthly BEAM trailing vol. in isolation

Ret. of Daily and Monthly BEAM by year (EW, within ind., Jan. 2001 – Dec. 2017)

Trailing 36-month Vol. of Daily and Monthly BEAM returns (EW, Within industries, topbottom deciles)







Is the efficacy of the BEAM signal affected by Bond Liquidity?

■To quantify bonds' liquidity, we employ Trade Efficiency Scores (TES)

Bond Trading Volume (TRACE)

Decile 1 – Highest Decile 10- Lowest





LCS (Liquidity Cost Score)

The cost of an immediate, institutionalsize, round-trip transaction, expressed as a percent of the bond's price*)

Quintile 1 – Lowest bid/ask

Quintile 5 – Highest bid/ask

* Note: LCS is calculated as

• OASD × (Bid spread – Ask spread) if quoted on spread

• (Ask price – Bid price) / Bid price if quoted on price

LCS was launched in October 2009 for USD IG and HY corporate bonds, with history available from January 2007. Currently, LCS is computed for ~20,000 bonds, published by Barclays QPS Research (see Konstantinovsky, 2017 for more details)

Sum is Mapped to

Trade Efficiency Scores

(TES: bond-level liquidity ranking)

1 – Best Trading Efficiency

10 – Worst Trading Efficiency

| LSC Quintile + | TES |
|----------------|-----|
| Volume Decile | |
| 2 and 3 | 1 |
| 4 and 5 | 2 |
| 6 | 3 |
| 7 | 4 |
| 8 | 5 |
| 9 | 6 |
| 10 | 7 |
| 11 | 8 |
| 12 | 9 |
| 13 to 15 | 10 |



BEAM Performance Is Better for More Liquid Bonds

We construct three TES categories:

- 1. "Low TES" (the most liquid segment of IG and HY bonds)
- 2. "Medium TES"
- 3. "High TES" (the least liquid bonds)
- BEAM performance increases with the liquidity of the bond, with an ann. return of 9.5%, and an ann. inf. ratio close to 1 for the most liquid bonds

TES x D-BEAM

Including other bonds in the universe still improved BEAM performance

Conditional Double Sort (EW, within industries, Feb. 2007 - Dec. 2017)

| | 1 20 11 0 0 2 11 11 1 | | | | | |
|----------------------------|-------------------------|----------------------------|--------|------|------|--|
| | | Conditional Sort on D-BEAM | | | | |
| | First Sorting Dimension | Low | Medium | High | H-L | |
| Avg. Ret (%/Yr) | Low TES (liquid) | 6.2 | 10.5 | 15.7 | 9.5 | |
| Vol. (%/Yr) | | 27.8 | 24.6 | 25.9 | 10.1 | |
| Sharpe (Inf.) Ratio (Ann.) | | 0.12 | 0.33 | 0.49 | 0.94 | |
| Avg. Ret (%/Yr) | Medium TES | 11.4 | 10.9 | 16.0 | 4.6 | |
| Vol. (%/Yr) | | 26.1 | 23.9 | 25.4 | 7.5 | |
| Sharpe (Inf.) Ratio (Ann.) | | 0.33 | 0.37 | 0.54 | 0.62 | |
| Avg. Ret (%/Yr) | High TES (illiquid) | 13.2 | 17.2 | 17.2 | 4.0 | |
| Vol. (%/Yr) | | 26.3 | 25.0 | 25.7 | 6.9 | |
| Sharpe (Inf.) Ratio (Ann.) | | 0.42 | 0.59 | 0.58 | 0.58 | |

| D-BEAM Performance | | | | | | |
|--|-----|--|--|--|--|--|
| (EW, Within industry, Top - Bottom Decile, Feb. 2007 -Dec. 2017) | | | | | | |
| Avg. Ret (%/Yr) 17 | '.1 | | | | | |
| Vol. (%/Yr) 10 |).5 | | | | | |
| Inf. Ratio (Ann.) | 62 | | | | | |

Source: Compustat, Barclays Research



Summary of Key Results

- Bond information is useful for equity momentum strategies at a daily frequency
- Unlike equities, there is no mean-reversion in equity returns based on daily bond signals
- The use of daily bond signals delivered:
 - + Annual avg. return of 18% and inf. ratio of 1.8 starting in 2001
 - + Positive returns in all years but one (2013) during the sample period
 - + Diversification to standard risk factors with highly significant alpha
 - + Possible enhancement to monthly BEAM when combined in a portfolio setting
- Consistent with prior results, ranking within industries leads to better performance compared with ranking across industries
- D-BEAM (L/S portfolio) vol is half that of the long or short portfolios in isolation, unlike when using equity signals to construct an equity momentum strategy
- Bond signal efficacy improves with bonds' liquidity



Using Credit Information to Improve PEAD Strategies

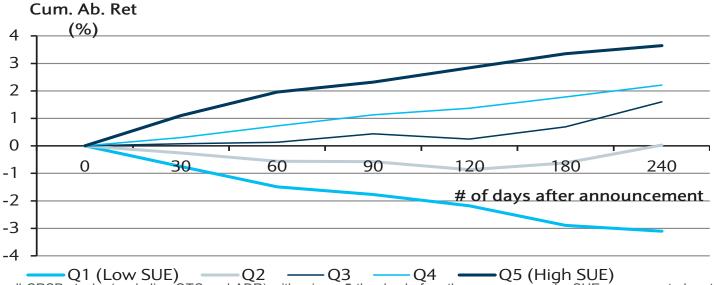
(Work in Progress)



The Post-Earnings Announcement Drift (PEAD)

- Ball and Brown (1968): sort firms on SUE (Standardized Unexpected Earnings) as a measure of earnings surprise = $\frac{(EPS_{i,q} EPS_{i,q-4}) \mu(\Delta EPS)_{i,q-1_to_q-8}}{\sigma(\Delta EPS)_{i,q-1_to_q-8}}$
- Firms with large pos. SUEs outperform in the subsequent 9-12 months, and vice versa
- A port. long (short) in stocks with the highest (lowest) earnings surprises provides a monthly return of 90bp/month [Chordia and Shivakumar (2006)]
- Widely confirmed in subsequent studies, including outside the US [Liu, Strong, Xu (2003), Gerard (2012), Griffin, Kelly, and Nardari (2010)]

Cum. Abnormal Returns of SUE Quintiles (1989-2004, EW, adj. for size and B/M)



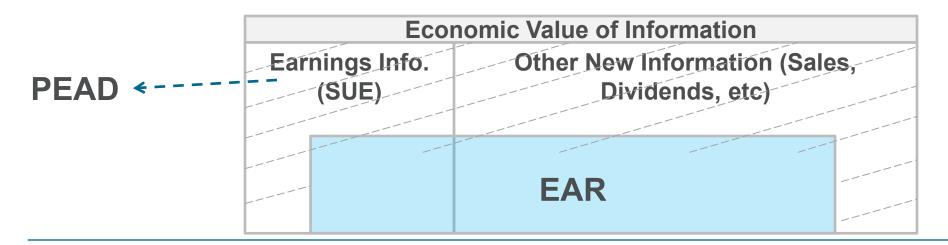
Note: Universe includes all CRSP stocks (excluding OTC and ADR) with price>=5 the day before the announcements. SUE are computed as the current year-to-year earnings change minus the average earnings change in the past eight quarters, standardized by the std. of earnings change in the past eight quarters. Quintile breakpoints were determined based on previous quarter SUE values.

Source: Barclays Research, Compustat



Earning Announcement Return (EAR): An Alternative Measure

- Financial reports also include information on items only partially related to innovation in earnings (sales, free cash flow), as well as possibly future guidance, changes in dividend policy, and business strategy
- Jegadeesh and Livnat (2006): Combining earnings and sales surprises leads to stronger post-earnings announcement drift
- Brandt, Kishore, Santa-Clara, and Venkatachalam (2008) use EAR to measure market reaction to all new information during announcements
- $EAR_{i,q} = \prod_{d=t-1}^{t+1} (1+R_{i,d}) \prod_{d=t-1}^{t+1} (1+FF_d)$, cumulative returns during earnings announcement window [-1,1] using the 25 Fama-French size and B/M portfolios





EAR and SUE Capture Different Information

- Firms were divided into 5x5 EAR-by-SUE buckets (SUE and EAR quintile breakpoints were determined independently from previous-quarter distribution)
- SUE and EAR measures exhibit low correlation: the overall rank correlation is 0.16
- Within SUE quintiles, sorting on EAR lead to positive subsequent abnormal ret spread over all horizons

Subsequent Cumulative Abnormal Return of EAR Q5 – EAR Q1 In each Independently sorted SUE Quintiles (1989-2004, EW)

| | SUE Q1 | SUE Q2 | SUE Q3 | SUE Q4 | SUE Q5 |
|----------|--------|--------|--------|--------|--------|
| 30 days | 1.23 | 0.99 | 1.02 | 1.77 | 2.28 |
| 60 days | 2.21 | 2.68 | 2.34 | 3.3 | 3.86 |
| 90 days | 2.21 | 3.12 | 2.32 | 3.01 | 4.33 |
| 120 days | 2.66 | 3.02 | 2.95 | 3.85 | 5.35 |
| 180 days | 4.3 | 4.47 | 4.36 | 5.11 | 7.08 |
| 240 days | 3.89 | 5.91 | 6.51 | 6.67 | 8.14 |



Source: Compustat, Barclays Research

Magnitude of PEAD Has Declined in Recent Years

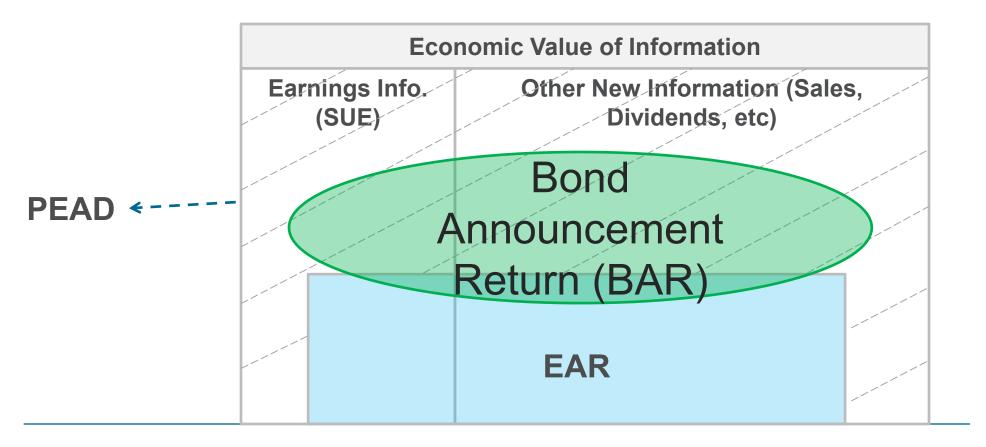
■ The PEAD in the recent period (2005-16) has weakened significantly compared with the earlier one (1989-2004), particularly for horizons beyond 30 days after the earnings announcement, regardless of the measure

| PEAD Abr | PEAD Abnormal Returns (EW) by Period and Measure | | | | | | | | | | | | | |
|--|--|---------|---------|---------|------------------|-----------|------|-----|-------|--|--|--|--|--|
| PEAD Abnmormal Returns (%) Based on SUE QUINTILES | | | | | | | | | | | | | | |
| | 2005-2016 1989-2004 | | | | | | | | | | | | | |
| Trading days following earnings announcement | Q1 (Low SUE) | Q2 | Q3 | Q4 | Q5 (High SUE) | Q5- Q1 | Q1 | Q5 | Q5-Q1 | | | | | |
| 30 | -0.9 | -0.5 | -0.1 | 0.1 | 0.6 | 1.5 | -0.8 | 1.1 | 1.9 | | | | | |
| 60 | -1.1 | -0.6 | 0.0 | 0.2 | 0.8 | 1.9 | -1.5 | 2.0 | 3.5 | | | | | |
| 90 | -1.7 | -0.9 | -0.1 | 0.1 | 0.6 | 2.3 | -1.8 | 2.3 | 4.1 | | | | | |
| 120 | -2.0 | -0.7 | -0.1 | 0.3 | 0.8 | 2.7 | -2.2 | 2.8 | 5.0 | | | | | |
| 180 | -2.4 | -0.7 | -0.2 | 0.3 | 0.5 | 2.9 | -2.9 | 3.4 | 6.2 | | | | | |
| 240 | -2.6 | -0.7 | -0.1 | 0.3 | 0.6 | 3.2 | -3.1 | 3.7 | 6.8 | | | | | |
| PEA | D Abnmorm | al Reti | urns (% | 6) Base | ed on EAR QU | INTILE | S | | | | | | | |
| Trading days following earnings announcement | Q1 (Low EAR) | Q2 | Q3 | Q4 | Q5 (High EAR) | Q5- Q1 | Q1 | Q5 | Q5-Q1 | | | | | |
| 30 | -0.7 | -0.4 | -0.3 | 0.0 | 0.5 | 1.1 | -0.7 | 1.1 | 1.7 | | | | | |
| 60 | -1.0 | -0.3 | -0.2 | 0.2 | 0.6 | 1.5 | -1.5 | 1.9 | 3.4 | | | | | |
| 90 | -1.3 | -0.7 | -0.5 | 0.2 | 0.4 | 1.6 | -1.4 | 2.3 | 3.7 | | | | | |
| 120 | -1.4 | -0.7 | -0.5 | 0.4 | 0.5 | 1.9 | -1.9 | 2.6 | 4.4 | | | | | |
| 180 | -1.8 | -0.7 | -0.8 | 0.5 | 0.4 | 2.2 | -2.5 | 3.6 | 6.1 | | | | | |
| 240 | -2.3 | -0.8 | -0.6 | 0.5 | 0.6 | 2.9 | -2.6 | 4.7 | 7.2 | | | | | |



Using Bond Announcement Return (BAR) as another indicator

- Similar to equity markets, bond markets react to all new information during earnings announcements
- Just as bond market signals have predictive power of future equity returns in BEAM at various frequencies, we expect bond investors to have valuable insights and incorporate the new information into bond prices during earnings announcements





PEAD For Stocks in Bond Universe Using EAR and SUE

- Bond Universe: RUSSELL3000 stocks with outstanding debt (avg. 720 firms per quarter)
- EAR quintiles in the bond universe produced similar results as in the Russell 3000
- SUE quintiles in the bond universe produced less pronounced PEAD at longer horizon
- Consistent with Ben Dor and Guan (2017)*, the degradation of PEAD is more evident for large caps and there is little drift after 90 days
- ■EAR results in stronger PEAD compared with SUE in the Bond Universe, similar to Brandt et al (2008), who find similar effects for large cap stocks

DEAD based on EAP and SLIE in Rond vs. Pussell 3000 Universe

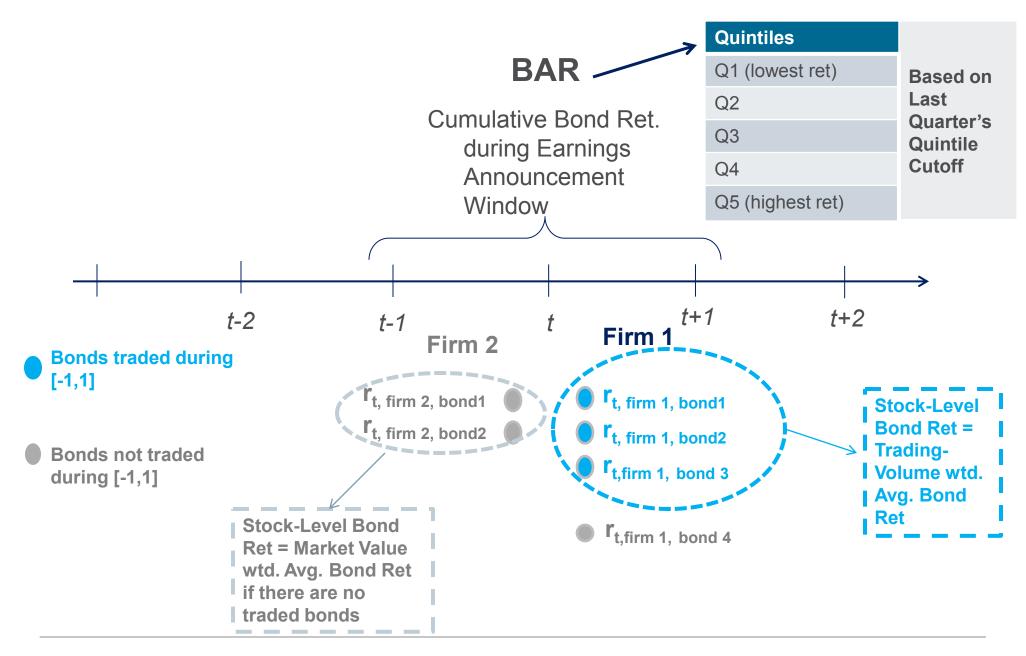
| | (%, subsequent abnormal ret. adj. for size and B/M, 2005 – 2017) | | | | | | | | | | | | | |
|---|--|------|-------|-------|---------|-------|-------|-------|------|------|-------|-------|--|--|
| | | Q5 | -Q1 | | | Q1 | | | | C | 25 | | | |
| | 30d | 90d | 180d | 240d | 30d | 90d | 180d | 240d | 30d | 90d | 180d | 240d | | |
| EAR Quintiles | | | | | | | | | | | | | | |
| Russell 3000 | 0.84 | 0.62 | 1.37 | 1.96 | -0.23 | -0.40 | -1.48 | -2.33 | 0.62 | 0.22 | -0.11 | -0.36 | | |
| Bond Universe | 0.97 | 0.93 | 1.13 | 1.28 | -0.25 | 0.08 | 0.36 | 0.17 | 0.72 | 1.01 | 1.50 | 1.44 | | |
| | | | | SU | JE Quin | tiles | | · | | | | | | |
| Russell 3000 1.23 1.25 1.34 1.58 -0.49 -0.92 -1.64 -2.16 0.73 0.75 0.33 0.2 | | | | | | | | | | | 0.20 | | | |
| Bond Universe | 0.86 | 0.68 | -0.21 | -0.69 | -0.43 | -0.40 | 0.33 | 0.65 | 0.43 | 0.27 | 0.12 | -0.04 | | |

Source: Compustat, Barclays Research

^{*} Note: Ben Dor, A. and J. Guan (2017). The Post-Earnings-Announcement Drift (PEAD): Has the Market Finally Caught Up? Barclays Live, May 2017



Constructing Bond Announcement Return (BAR)





Bond and Equity Market Reactions Had Low Correlations

- BAR and EAR quintile ranks have low correlation of 0.11
- Within each BAR quintile, EAR's Q5-Q1 have a small but positive BAR spread consistent with low correlation between the two signals

Average BAR [-1,1] during announcement window in 5x5 BAR-by-EAR Buckets (%, EW, 2005-2017)

| | EAR Q1 (Low) | Q2 | Q3 | Q4 | EAR Q5 (High) | EAR Q5-Q1 |
|---------------|--------------|------|------|------|---------------|-----------|
| BAR Q1 (Low) | -1.1 | -0.6 | -0.6 | -0.6 | -0.6 | 0.5 |
| Q2 | -0.1 | -0.1 | -0.1 | -0.1 | -0.1 | 0.0 |
| Q3 | 0.1 | 0.0 | 0.0 | 0.0 | 0.1 | 0.0 |
| Q4 | 0.3 | 0.2 | 0.2 | 0.2 | 0.3 | 0.0 |
| BAR Q5 (High) | 0.9 | 0.7 | 0.7 | 0.8 | 1.2 | 0.3 |
| BAR Q5 - Q1 | 2.0 | 1.3 | 1.3 | 1.4 | 1.8 | |

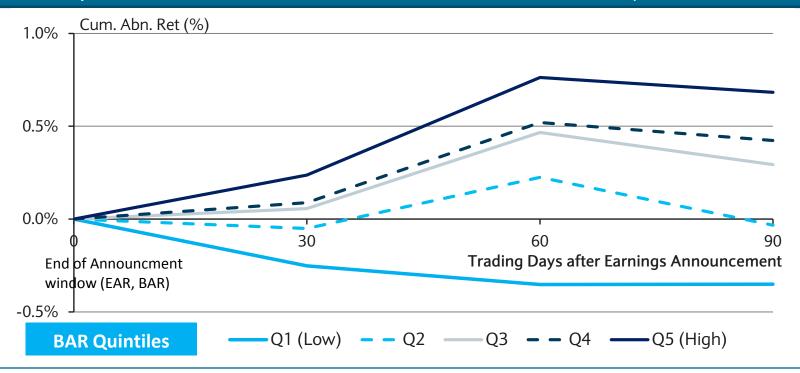
Source: Compustat, TRACE, Barclays Research

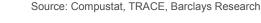


The Relation between BAR and PEAD

- Due to the degradation of PEAD in recent years, especially in large cap stocks, the analysis was focused on 30/60/90 day post announcement horizon
- Cumulative abnormal return generated by BAR Q5 is 1.03% higher than that of BAR Q1 in the 90 subsequent trading days after earnings announcements
- PEAD increased monotonically with the level of BAR over the 90 days following earnings announcements

Subsequent Cum. Abnormal Ret. based on BAR Quintiles (%, EW 2005 – 2017)







BAR Improved the Efficacy of SUE and EAR

- Composite Score = Average of EAR, SUE, and BAR quintile ranks
- Stocks were assigned into quintiles based on their Composite Scores using previous quarter's Composite Score cutoffs
- Employing the Composite Score generated higher Q5-Q1 returns than using only individual earnings surprises measures or a composite score based only on EAR and SUE (EAR+SUE)*

| PEAD Cum. Abnormal Returns (9 | %) Based on Composite Score | (EW, 2005-2017) |
|-------------------------------|-----------------------------|-----------------|
|-------------------------------|-----------------------------|-----------------|

| | | Trading Da | nys After Earnings Anno | uncement |
|-----------------|-----------|------------|-------------------------|----------|
| | | 30 | 60 | 90 |
| EAR | Q5-Q1 | 0.97*** | 0.72 | 0.93 |
| SUE | Q5-Q1 | 0.86** | 1.21* | 0.68 |
| EAR+SUE | Q5-Q1 | 1.24*** | 1.04 | 0.49 |
| BAR | Q5-Q1 | 0.49 | 1.12*** | 1.03** |
| | Q5-Q1 | 1.19*** | 1.65** | 1.55 |
| | Q1 (Low) | -0.64 | -0.80 | -0.73 |
| Composite Score | Q2 | -0.07 | 0.19 | 0.11 |
| (EAR+SUE+BAR) | Q3 | 0.08 | 0.44 | 0.11 |
| | Q4 | 0.16 | 0.58 | 0.11 |
| | Q5 (High) | 0.56 | 0.85 | 0.82 |

^{*}Note: EAR+SUE is the Avg. (EAR & SUE Quintile Ranking). Stocks are sorted into quintile buckets based on last quarter's EAR+SUE quintile cutoffs. The superscripts ***, **, and * indicate statistical significance at the 1%, 3% and 5% level.

Source: Compustat, TRACE, Barclays Research



PEAD in Dynamic Portfolio Setting

Each month, there are different sets of firms making earnings announcements

We investigated three look-back windows to determine stocks to include in the

universe: 1M, 2M, and 3M

■1M: use more recent information, high turnover

■3M: use more stale information, lower turnover

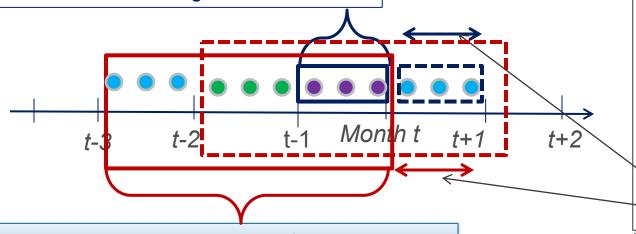
Composition of L/S Portfolios formed on Composite Score (2005 – 2017)

| | 1M | 2M | 3M | |
|---------------------------|------|------|-----|--|
| Turnover | 200% | 124% | 70% | |
| Avg. # of stocks (L+S) | 107 | 213 | 310 | |

Source: Compustat, TRACE, Barclays Research

1M Lookback Portfolio

At end month t, look at stocks that announced earnings in **that month**



3M Look-back Portfolio

At end month t, look at stocks that announced earnings in the **last 3 month (t-2 to t)**

Portfolio formation

- Assign stocks into buckets based on previous quarter's quintile cutoff of earnings measure
- Construct L /S portfolios (Q5 – Q1)
- EW portfolios
- Holding Period = 1M
- Monthly Rebalancing at the end of each month



The Composite Score Generated Better Performance

- The Composite Score generated
 - √ Higher returns
 - √ Higher information ratio
 - ✓ Better maximum DD

than any individual earnings surprises measures and EAR + SUE combined

Performance decreased as lookback horizon increased and information got more stale

| | Portfolio Performance (EW, 2005 – 2017) | | | | | | | | | | | | | |
|--------------------|---|--------------------|--------|--------|--------|---------|--|--|--|--|--|--|--|--|
| Lookback Window | | Composite Score | EAR | SUE | BAR | EAR+SUE | | | | | | | | |
| | Avg. Ret (%/Yr) | 9.88 | 4.67 | 8.60 | 4.77 | 4.46 | | | | | | | | |
| 1M | Vol. (%/Yr) | 14.11 | 12.23 | 12.75 | 12.08 | 13.75 | | | | | | | | |
| 1771 | Inf. Ratio (Ann.) | 0.70 | 0.38 | 0.67 | 0.39 | 0.32 | | | | | | | | |
| | Max. DD (%) | -19.10 | -24.45 | -36.69 | -31.75 | -43.03 | | | | | | | | |
| | Avg. Ret (%/Yr) | 5.68 | 0.73 | 4.20 | 2.88 | -0.58 | | | | | | | | |
| 2M | Vol. (%/Yr) | 10.43 | 10.01 | 8.67 | 6.45 | 12.67 | | | | | | | | |
| ZIVI | Inf. Ratio (Ann.) | 0.54 | 0.07 | 0.48 | 0.45 | -0.05 | | | | | | | | |
| | Max. DD (%) | -30.46 | -33.63 | -28.30 | -17.18 | -51.00 | | | | | | | | |
| | Avg. Ret (%/Yr) | 3.56 | 0.31 | 2.10 | 2.36 | -0.14 | | | | | | | | |
| 21.4 | Vol. (%/Yr) | 10.06 | 9.22 | 8.17 | 6.56 | 11.09 | | | | | | | | |
| 3M | Inf. Ratio (Ann.) | 0.35 | 0.03 | 0.26 | 0.36 | -0.01 | | | | | | | | |
| | Max. DD (%) | -30.09 | -33.61 | -32.85 | -16.72 | -41.92 | | | | | | | | |

Source: Compustat, TRACE, Barclays Research



BAR Added Value Even after Controlling for Risk

 Composite Score produces highest and most statistically significant alphas, regardless of the lookback period

Risk Model Regressions for PEAD Portfolios (Dep. Var.: monthly PEAD portfolio ret (%), EW, 2005 – 2017)

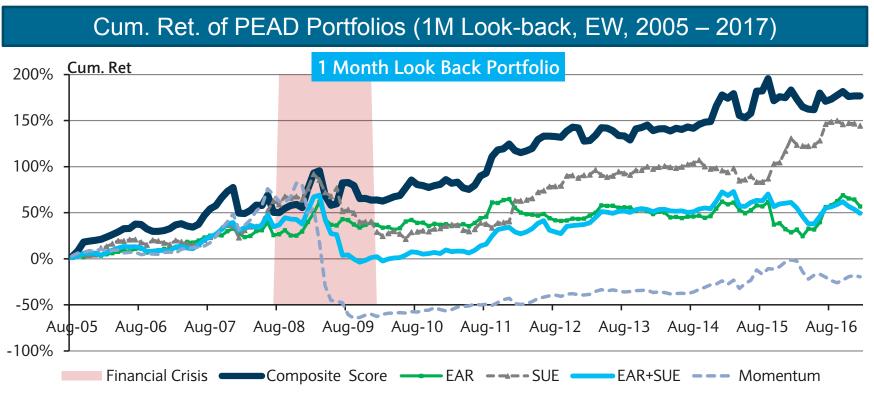
| LookBack | kBack Composite Score | | ore | SUE | | | | EAR | | | BAR | | | EAR+SUE | | |
|----------|-----------------------|----------|----------|---------|---------|---------|-------|---------|----------|---------|---------|---------|----------|----------|---------|--|
| Period | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | |
| Alpha | 0.99*** | 0.7*** | 0.46** | 0.81** | 0.45*** | 0.22 | 0.53 | 0.24 | 0.20 | 0.57 | 0.34** | 0.27 | 0.61* | 0.22 | 0.20 | |
| MKT-Rf | -0.12 | -0.18*** | -0.15*** | -0.05 | -0.07 | 0.00 | -0.15 | -0.13* | -0.14*** | -0.15 | -0.09 | -0.1** | -0.25*** | -0.26*** | -0.2*** | |
| SMB | -0.16 | -0.09 | -0.06 | 0.26 | 0.07 | 0.05 | 0.08 | -0.10 | -0.10 | -0.23 | -0.03 | -0.04 | 0.09 | -0.04 | -0.08 | |
| HML | -0.17 | -0.07 | -0.07 | -0.08 | -0.05 | -0.10 | -0.10 | -0.03 | -0.02 | 0.16 | 0.11 | 0.05 | -0.18 | -0.12 | -0.10 | |
| RMW | -0.34 | -0.39** | -0.29* | -0.11 | -0.19 | -0.15 | -0.12 | -0.23 | -0.22 | -0.20 | -0.14 | -0.07 | -0.26 | -0.27 | -0.26 | |
| CMA | 0.18 | 0.04 | 0.18 | -0.07 | -0.06 | 0.02 | -0.14 | -0.01 | -0.03 | -0.02 | -0.08 | 0.15 | -0.12 | -0.22 | -0.09 | |
| MTM | 0.34*** | 0.36*** | 0.38*** | 0.26*** | 0.36*** | 0.33*** | 0.15 | 0.28*** | 0.3*** | 0.18*** | 0.13*** | 0.13*** | 0.35*** | 0.41*** | 0.39*** | |

Note: The superscripts ***, **, and * indicate statistical significance at the 1%, 3% and 5% level. Source: Compustat, TRACE, Barclays Research



BAR Inclusion Led to Consistent Performance over Time

- The 1M portfolio constructed from **Composite Score** consistently produced higher and less volatile returns than each individual earnings surprises measures or EAR+SUE combined score over time
- The portfolio based on Composite Score also had lower DD in the financial crisis
- •The Composite Score portfolio had more steady performance than the standard momentum portfolio*



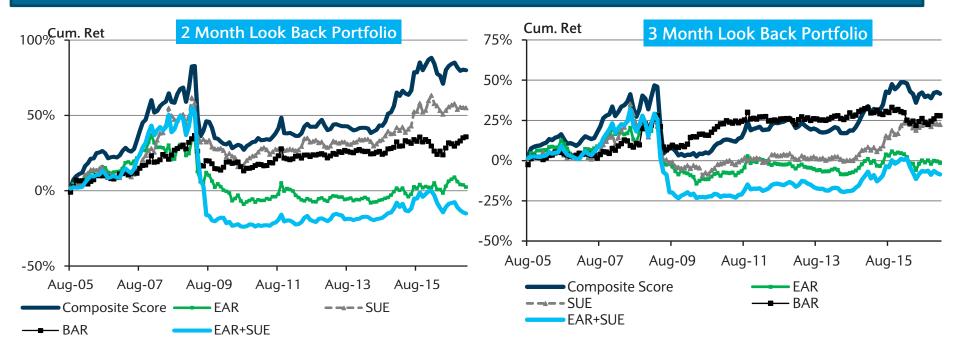
Note: The momentum portfolio return are the EW top –bottom decile momentum portfolio from Ken French's data library. Source: Compustat, TRACE, Ken French Data Library, Barclays Research



Performance Deteriorated for Longer Look-Back

■ With 2M and 3M lookback windows, the portfolio constructed from **Composite Score** still produced higher returns than each individual earnings surprises measures or EAR+SUE combined score over time, but the overall cumulative returns were much smaller

Cumulative Return of PEAD Portfolios (2M and 3M Lookback, EW, 2005 – 2017)







Composite Score Retained Its Efficacy after Controlling for Size

■ The Composite Score also had larger and more significant alpha than the other two measures in the large cap sub-sample (members of bond universe that are constituents of Russell 1000)

Risk Model Regressions for **Large Cap** (Russell 1000) PEAD Portfolios (Dep. Var.: monthly PEAD portfolio ret (%), EW, 2005 – 2017)

| | Con | iposite Sc | ore | | SUE | | EAR | | | |
|-----------------|---------|------------|---------|-------|---------|---------|---------|---------|--------|--|
| LookBack Period | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | |
| Alpha | 0.96*** | 0.57*** | 0.33* | 0.64 | 0.44** | 0.25 | 0.72** | 0.27 | 0.12 | |
| MKT-Rf | 0.01 | -0.16** | -0.11* | -0.04 | -0.08 | -0.02 | -0.08 | -0.12 | -0.10 | |
| SMB | -0.05 | -0.09 | -0.09 | 0.24 | 0.03 | -0.01 | 0.09 | -0.12 | -0.09 | |
| HML | -0.16 | 0.00 | -0.02 | -0.02 | -0.04 | -0.10 | 0.01 | 0.04 | 0.02 | |
| RMW | -0.10 | -0.35** | -0.29* | -0.05 | -0.29* | -0.31* | -0.13 | -0.20 | -0.13 | |
| CMA | 0.18 | 0.02 | 0.11 | -0.03 | -0.06 | 0.03 | 0.04 | 0.00 | -0.13 | |
| MTM | 0.32*** | 0.37*** | 0.38*** | 0.22* | 0.37*** | 0.36*** | 0.21*** | 0.29*** | 0.3*** | |

Note: The superscripts ***, **, and * indicate statistical significance at the 1%, 3% and 5% level. Source: Compustat, TRACE, Barclays Research



Credit Signal Added Value in Recent Period

- For 2010-17, EAR, SUE, or the combined score (EAR+SUE) did not show statistically significant alphas
- Composite Score still generated economically and statistically significant alpha in this period

Risk Model Regressions for PEAD Portfolios in Recent Period (Dep. Var.: monthly PEAD portfolio ret (%), EW, 2010 – 2017)

| Look | Back | C Composite Score SUE | | | EAR | | | BAR | | | EAR+SUE | | | | | |
|------|------|-----------------------|----------|----------|-------|---------|---------|----------|----------|----------|---------|-------|-------|---------|----------|----------|
| Peri | od | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M | 1M | 2M | 3M |
| Alpl | ha | 0.74** | 0.51** | 0.45** | 0.40 | 0.11 | 0.16 | 0.49 | 0.20 | 0.22 | 0.23 | 0.33 | 0.27 | 0.60 | 0.24 | 0.29 |
| MKT | -Rf | -0.2** | -0.19*** | -0.15*** | 0.21 | 0.03 | 0.03 | -0.32*** | -0.21*** | -0.15*** | -0.02 | -0.1* | -0.07 | -0.21** | -0.24*** | -0.19*** |
| SM | IB | -0.08 | -0.02 | 0.05 | 0.05 | 0.05 | 0.09 | 0.28 | 0.08 | 0.06 | -0.05 | 0.03 | -0.01 | 0.20 | 0.05 | 0.08 |
| HM | ۱L | 0.02 | -0.23 | -0.26** | -0.04 | -0.04 | -0.13 | -0.11 | -0.38*** | -0.33*** | 0.28 | 0.07 | 0.05 | -0.09 | -0.31** | -0.28** |
| RM | W | 0.02 | -0.09 | -0.03 | 0.19 | -0.03 | 0.04 | 0.03 | -0.03 | -0.09 | 0.17 | 0.00 | -0.08 | 0.08 | -0.10 | 0.01 |
| CM | Α | 0.20 | 0.22 | 0.4** | 0.25 | 0.06 | 0.24 | 0.04 | 0.20 | 0.20 | -0.40 | -0.07 | 0.05 | 0.11 | 0.16 | 0.28 |
| MT | M | 0.44*** | 0.24*** | 0.2*** | 0.06 | 0.33*** | 0.27*** | 0.13 | 0.06 | 0.07 | 0.28** | 0.03 | 0.05 | 0.36*** | 0.29*** | 0.24*** |

Note: The superscripts ***, **, and * indicate statistical significance at the 1%, 3% and 5% level. Source: Compustat, TRACE, Barclays Research



Concluding Remarks



Summary

- ❖ BEAM strategy outperformed Equity Momentum out of sample since its introduction in 2014
- All the main features of the BEAM strategy are also evident in European markets
- ❖ The use of daily bond signals delivered an annual average return of 18% and an information ratio of 1.8 starting in 2001. Moreover, they continued to generate momentum patterns, while equity returns exhibited mean-reversion at higher frequency
- Using bond signals also improved the efficacy of traditional PEAD measures



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