Estimize and Forcerank

Designing, collecting and using proprietary data sets to generate uncorrelated alpha



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- Portfolio Manager, running statistical arbitrage strategies at Geller Capital
- Founder and CIO at Surfview Capital
- Product and business development at StockTwits
- Founder and CEO at Estimize and Forcerank
- Advisor to Slingshot Insights, Alta5, and Barclays TechStars Fintech
 Accelerator
- Forbes' 30 Under 30, Goldman Sachs' 100 Entrepreneurs, Forbes' Fintech 50, Forbes' 10 Hottest Startups, Entrepreneur Magazine's 100 Brilliant Companies, Fast Company's 10 Most Innovative Companies



Discretionary funds are in trouble.

The market is being dominated by data-driven quants.

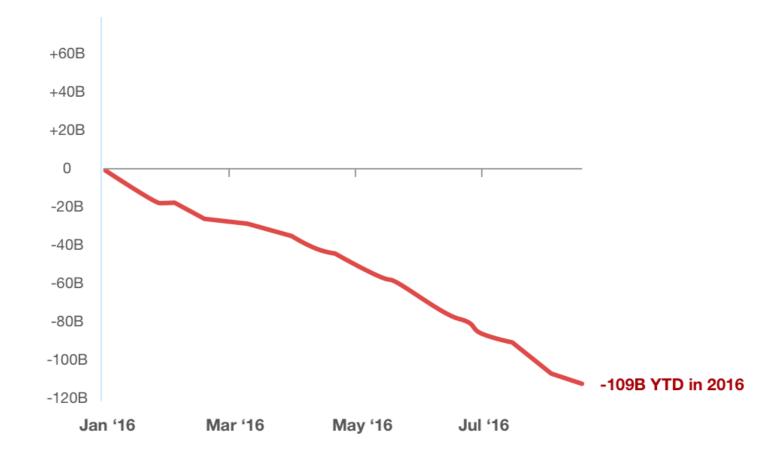
So we know you've had a tough year.

We know there's less alpha in the market.

You know you need to be more data-driven to compete with systematic traders.

Outflows from Active Discretionary Funds In 2016

Source: J.P. Morgan US Equity Strategy & Global Quant Research, EPFR





We know that you are exploring a more data-driven investment process.

But there is too much data to sift through.

Integrating new tools are a **hassle**.

And you need something that **complements** your current process.

Good Crowdsourcing Requires

- ✓ Diversity of opinion different background info
- ✓ Decentralization specialize and use local knowledge
- ✓ Sample size bigger is better
- ✓ Independence opinions not determined by others

Research and Strategic Design

- ✓ Question does it matter, replacement heuristic
- ✓ Interval randomness, user engagement cycle, use
- ✓ Panel can you acquire them, who can answer the question
- ✓ Differentiation will it produce uncorrelated signal
- ✓ Market total addressable market, is it a strategic threat





Rick Johnston, Rice University

"Competition For Sell-Side Analysts?"

Estimize as a crowdsourcing platform represents a market solution to the shortcomings associated with sell-side analyst forecasts perhaps resulting from their incentives. **The application of technology to enhance the information environment of firms is**

innovative and possibly revolutionary.



WE BELIEVE

Our platform which crowdsources financial estimates from an open community of buy-side, independent & amateur contributors is the **natural evolution of our industry**.

The community has populated this data set over the last five years in order to individually benefit from a more robust, inclusive data set—think Wikipedia or StackOverflow.

A more accurate and representative earnings data set will allow you to **build better models and generate alpha.**

Estimize crowdsources the **most accurate** and **most representative** financial estimates on over 2,000 stocks from 40,000 buy-side, independent and amateur analysts.

Estimize vs IBES/Bloomberg

- ✓ Sell-side
- ✓ Buy-side
- ✓ Independent Experts
- ✓ Amateurs
- √ Students

✓ Sell-side



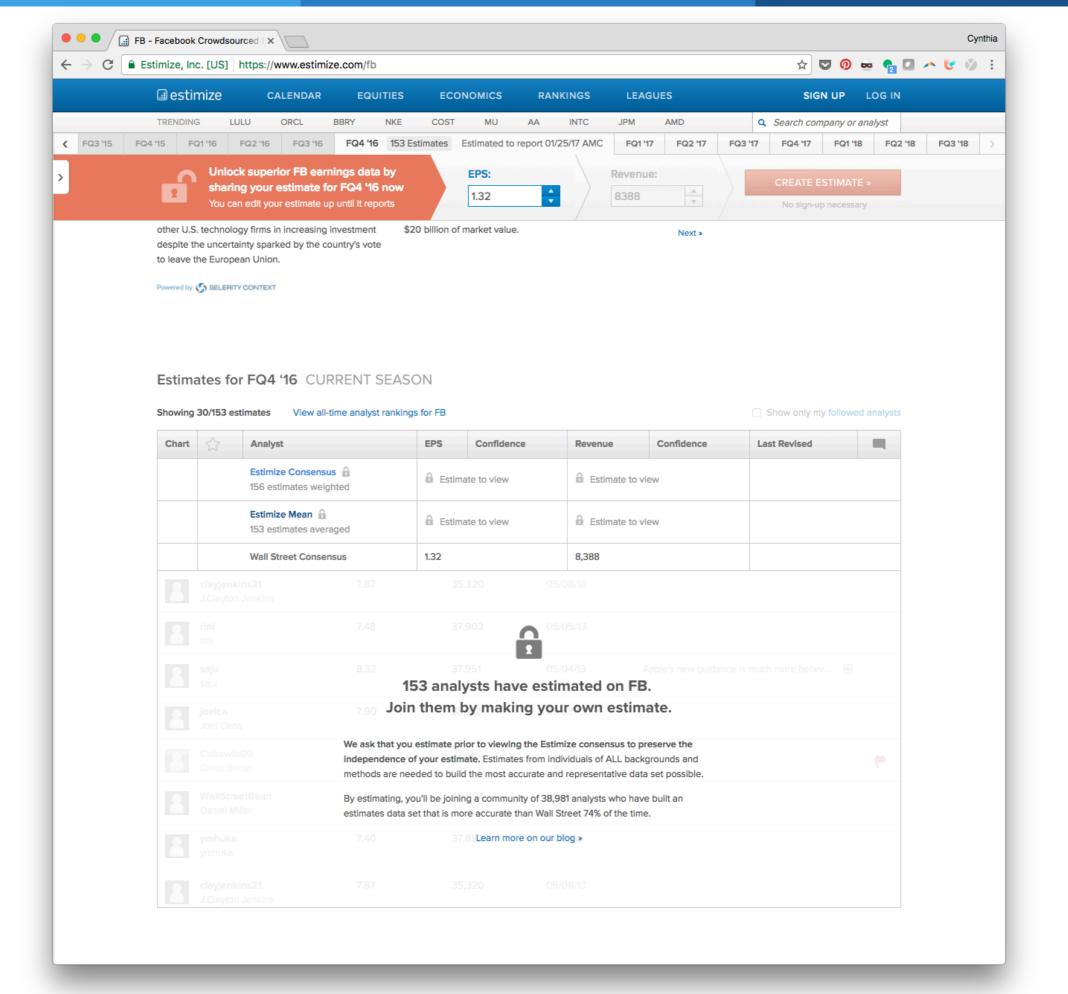
Revenue

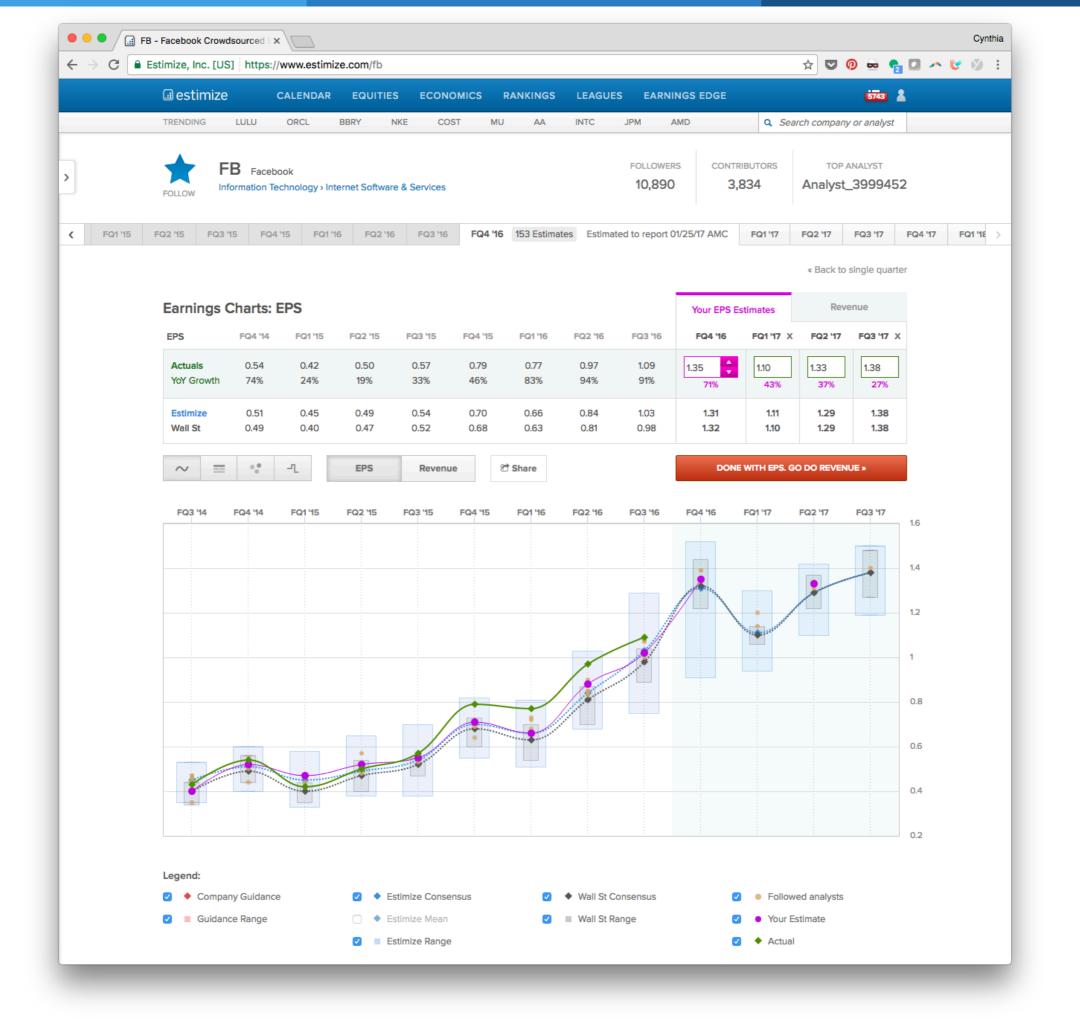
Analysts are incentivized to contribute their most accurate estimates to:

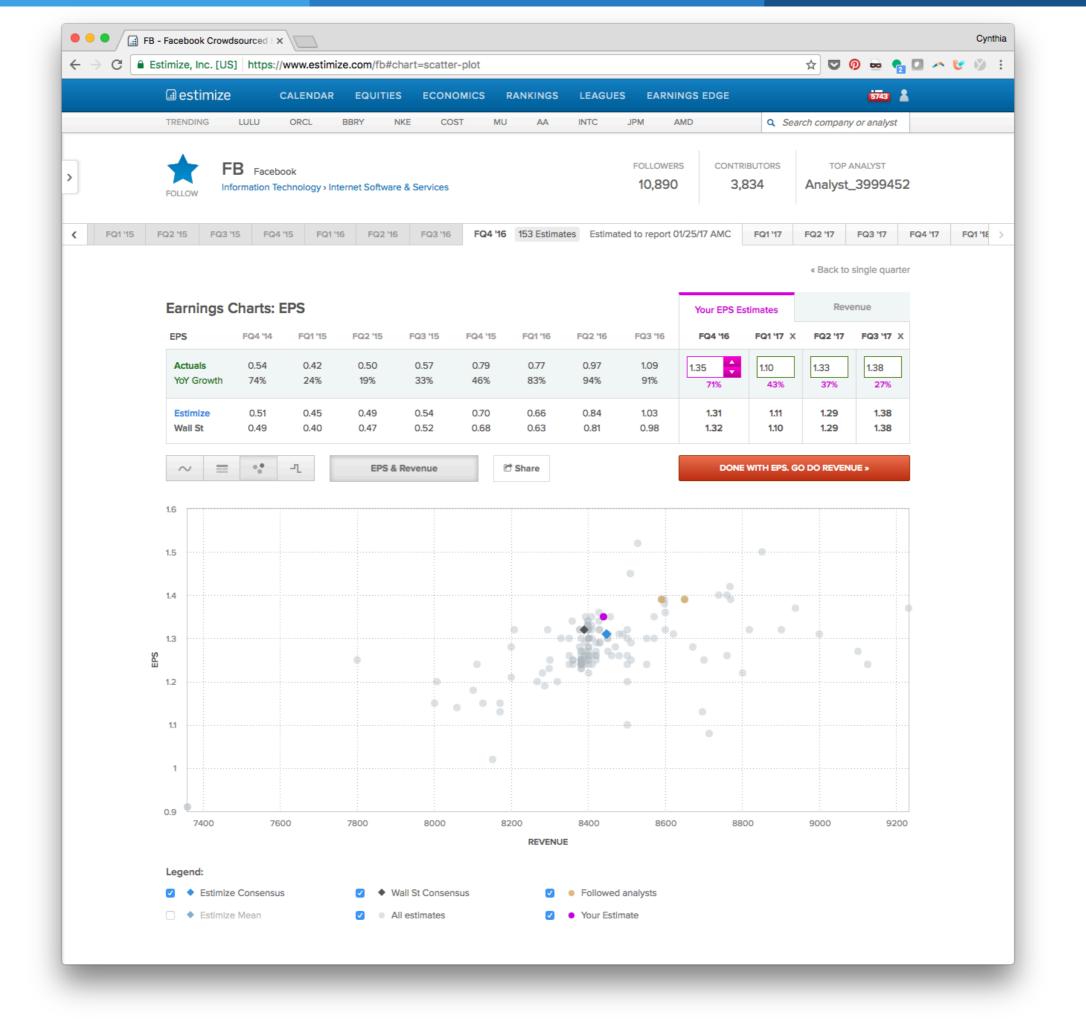


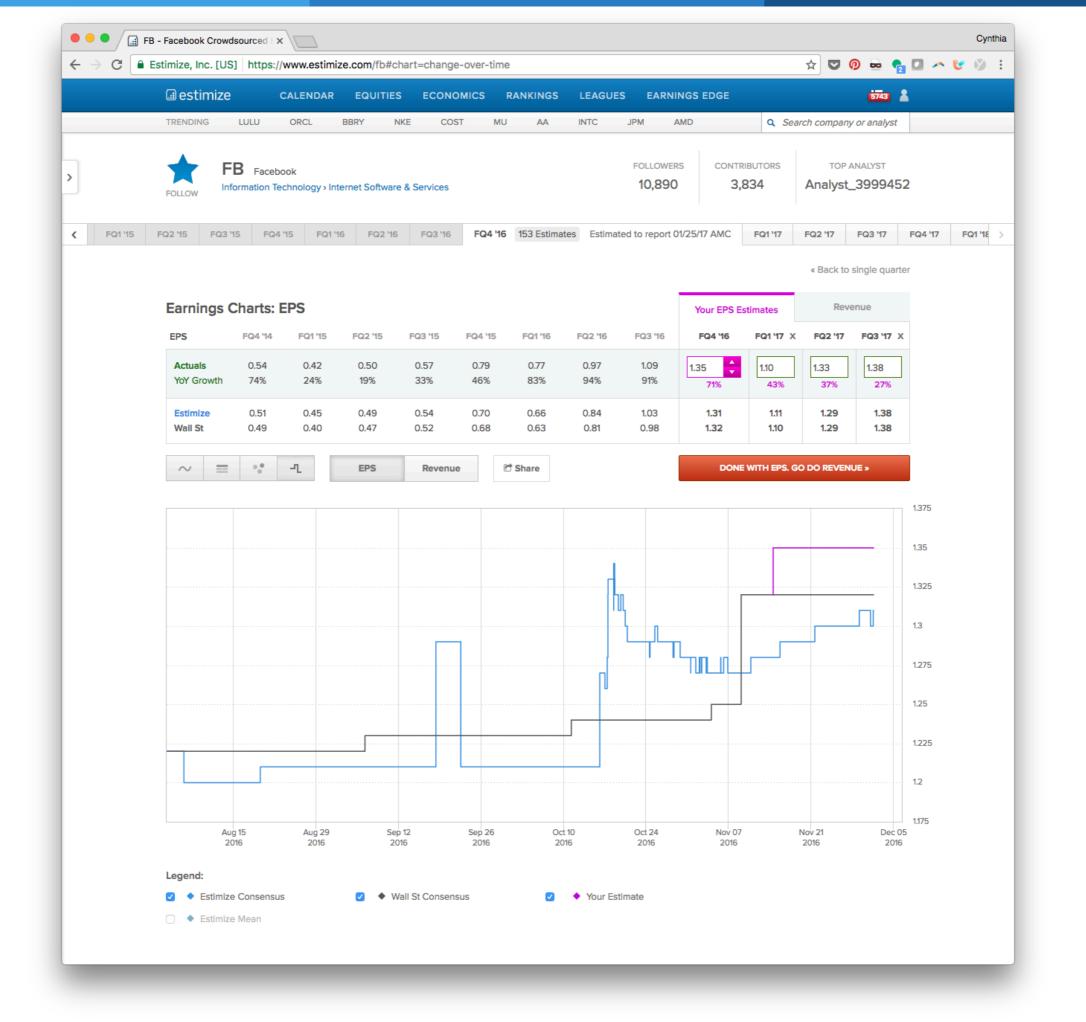


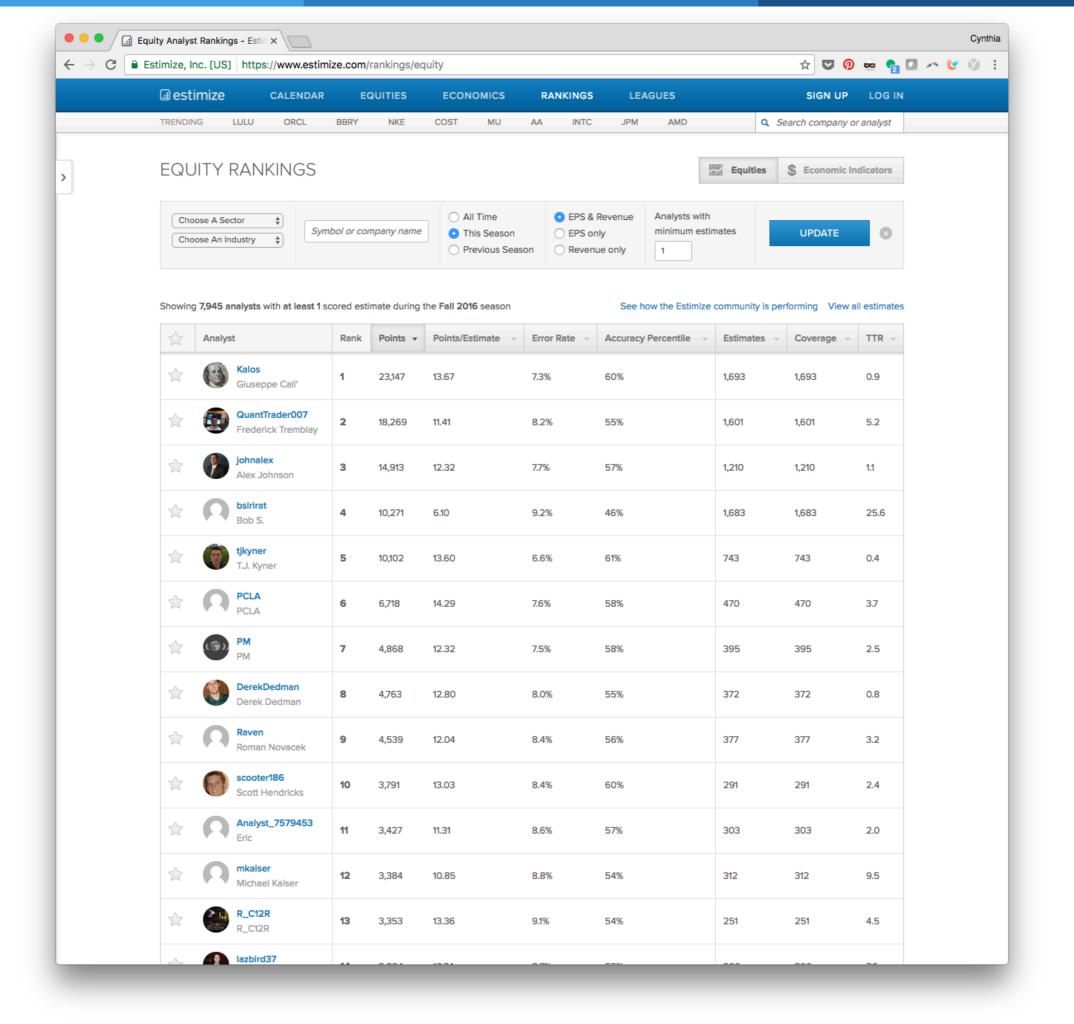
Build a verifiable track record











TRUSTED BY INDUSTRY LEADERS

OUR CLIENTS INCLUDE







CONSENSUS REGULARLY CITED ON LEADING MEDIA PLATFORMS





Bloomberg





BARRON'S

Top Websites To Help Investors Survive Earnings Season July 2016

FAST @MPANY

10 Most Innovative Companies

February 2014



100 Brilliant Companies

May 2014

Not only is it more accurate... it's more representative

"We found multiple benefits to using the Estimize dataset; **especially in the case of short term applications in which accuracy is essential.** The diversity of contributors provides a greater spectrum of information which can improve investment strategies."



ACADEMIC VALIDATION



Rick Johnston, Rice University

"Competition For Sell-Side Analysts?"

Estimize as a crowdsourcing platform represents a market solution to the shortcomings associated with sell-side analyst forecasts perhaps resulting from their incentives. The application of technology to enhance the information environment of firms is

innovative and possibly revolutionary.



Biljana Abebambo & Barbara Bliss, University of San Diego

"The Value of Crowdsourcing: Evidence from Earnings Forecasts"

The Estimize consensus produces errors that are more strongly associated with abnormal returns, suggesting that it is a superior measure of the market's true earnings expectations.







Best in Class For Creating Proprietary Data 2015

BUSINESS INSIDER

20 startups out to create a new world order on Wall Street 2015

Quant Research Steps

- 1. **Whachagotthere:** What are we working with, basically everything we discussed in research design and the outcome of the experiment.
- 2. **Hypothesis:** Must start with an ex-ante hypothesis regarding some causal relationship between the data and a market outcome.
- 3. **Event Study:** For each event in our time series, what is the absolute return, market neutral return, and residual return, how does it perform out of sample?
- 4. **Portfolio Construction:** If we were to trade this as a single factor, how would we construct a portfolio?
- 5. **Residual Alpha:** If we use this factor to weight our multi factor model, does it produce residual uncorrelated alpha to our current model?

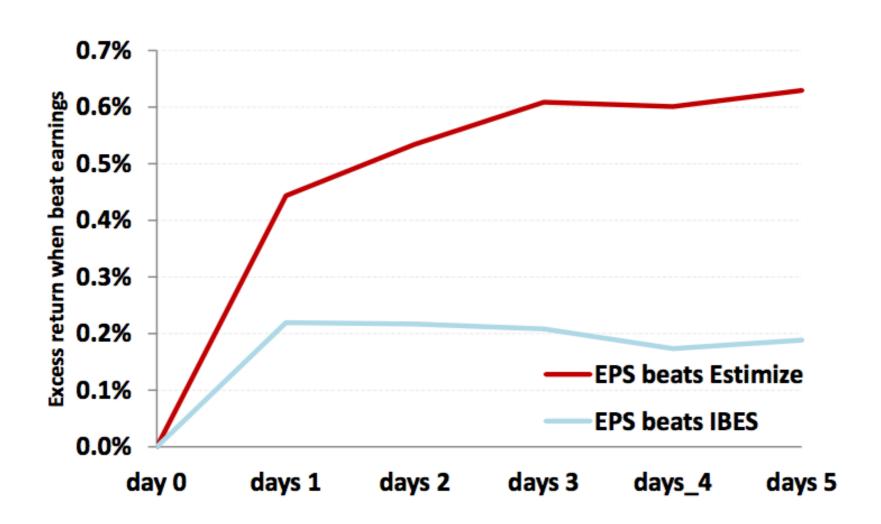
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Post-Earnings Drift Strategy

The more representative Estimize Consensus can greatly improve the classic post earnings drift strategy that has been used by systematic quants over the past 25 years.

Cumulative excess return when estimates

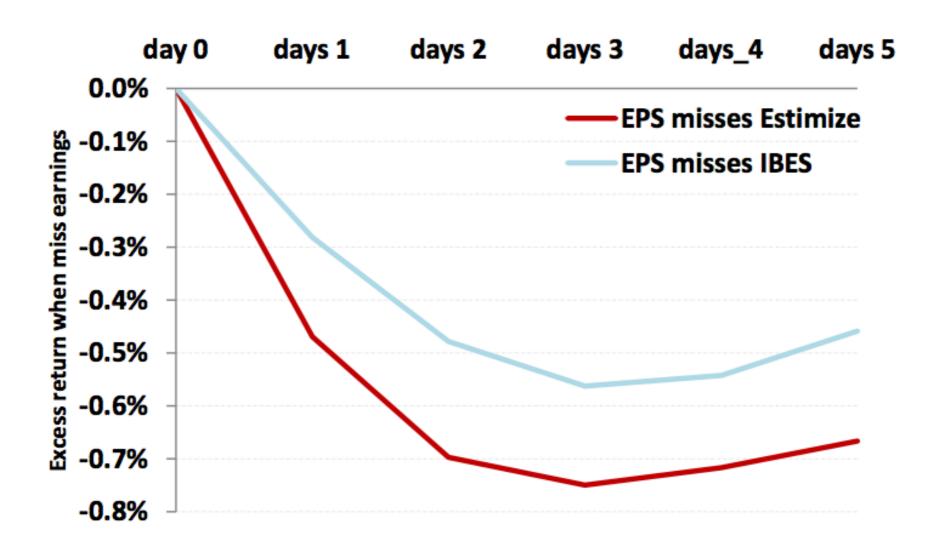
Beat earnings by more than 10%



Source: Estimize, Compustat, IBES, Russell, S&P, Thomson Reuters, Deutsche Bank

Cumulative excess return when estimates

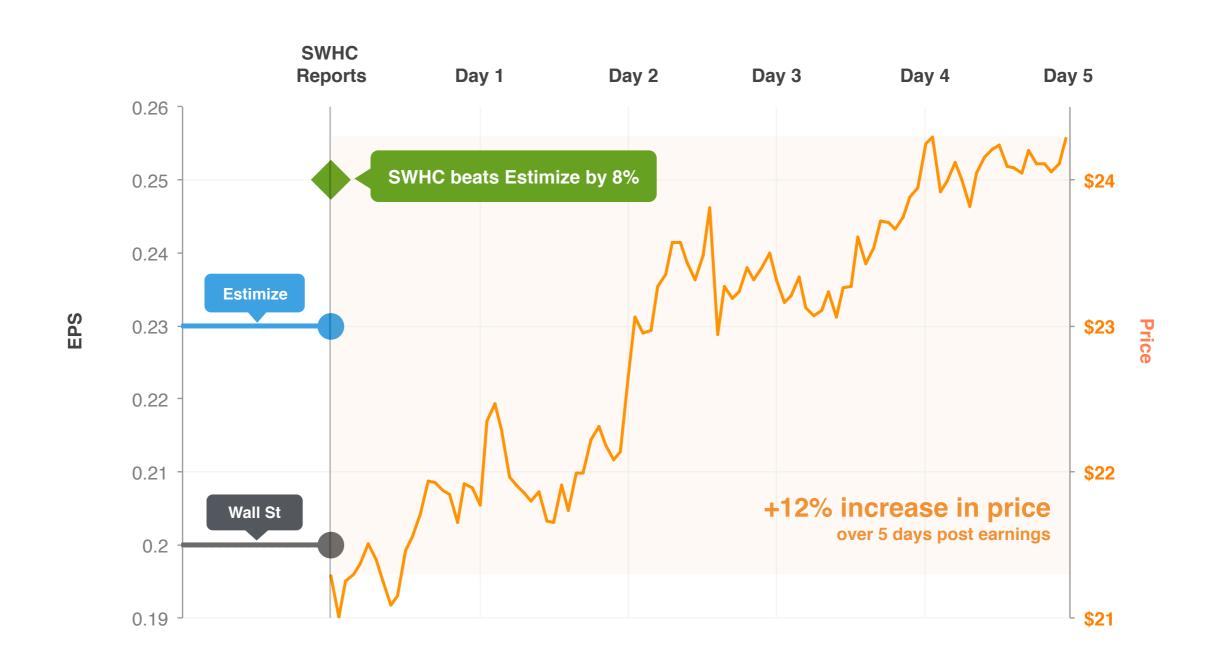
Miss earnings by more than 10%



Source: Estimize, Compustat, IBES, Russell, S&P, Thomson Reuters, Deutsche Bank

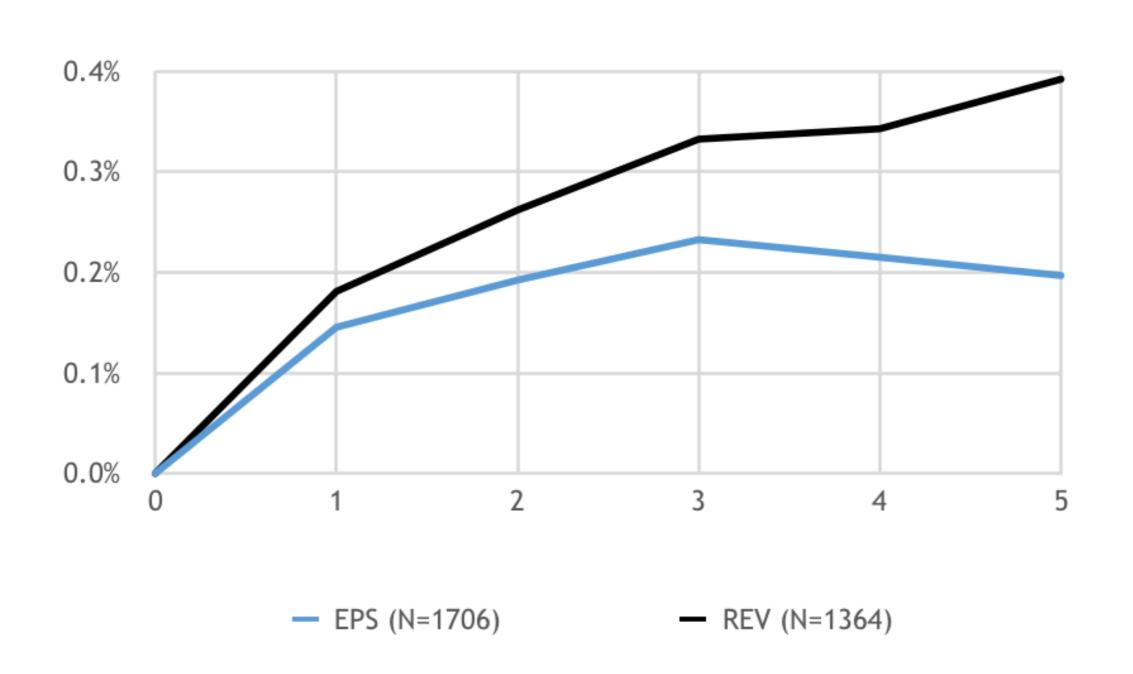
BUY - Smith & Wesson Holding Corporation (SWHC) - FQ2 '16

Post earnings when \$SWHC beat both Estimize and Wall Street Consensus



Signed cumulative residual returns when

Estimize & Wall St surprises in opposite directions



SELL - Facebook (FB) - FQ1 '15

Post earnings when \$FB missed Estimize but beat Wall Street



Post-Earnings Drift with Mean-Ratio Normalization EPS

First we calculate the average of absolute surprise for the previous 12 quarters for each stock (or as many quarters as we have for recent IPOs). We then get the ratio of current surprise to the historical mean to represent the magnitude of the beat/miss.

Mean Ratio = (Absolute value of current surprise) / (Mean of absolute value of surprise for the past 12 quarters)

At the open of trading the day after (if report is PM) or the day of (if report is AM) we take trades where (current surprise * Mean Ratio) is more than 10%.

		1 DAY			5 DAY			20 DAY					
Trade	Number of Trades	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return
Long	4878	2.169	0.062	2.107	7.599	2.625	0.219	2.406	9.670	4.096	1.000	3.096	12.953
Short	3132	-2.458	0.071	-2.529	7.721	-1.916	0.278	-2.194	10.900	-0.532	1.055	-1.587	15.246

Post-Earnings Drift with Mean-Ratio Normalization Revenue

First we calculate the average of absolute surprise for the previous 12 quarters for each stock (or as many quarters as we have for recent IPOs). We then get the ratio of current surprise to the historical mean to represent the magnitude of the beat/miss.

Mean Ratio = (Absolute value of current surprise) / (Mean of absolute value of surprise for the past 12 quarters)

At the open of trading the day after (if report is PM) or the day of (if report is AM) we take trades where (current surprise * Mean Ratio) is more than 5%.

		1 DAY			5 DAY			20 DAY					
Trade	Number of Trades	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return	Absolute Return	SP500	Relative Return	Std Deviation of Abs Return
Long	2687	2.110	0.071	2.039	7.137	2.392	0.251	2.142	9.294	3.656	1.028	2.627	13.126
Short	3065	-1.662	0.069	-1.731	7.622	-1.167	0.257	-1.424	10.953	0.286	0.989	-0.703	15.588

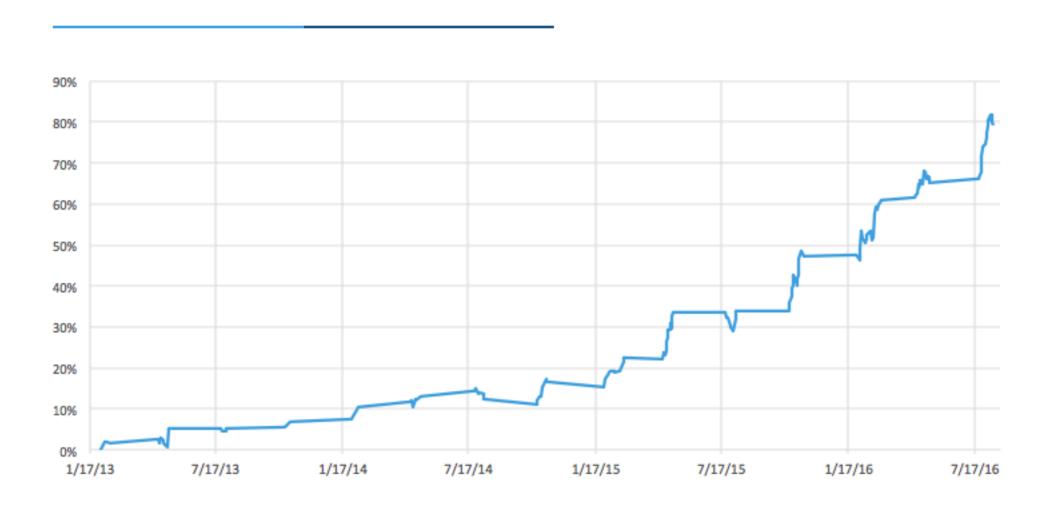
You can easily leverage our research. We've put our drift strategies into a **factor model**.

We create a -100 to +100 score for each stock each day based on our pre and post earnings drift factors.

The Estimize Post Earnings Drift Factor Model has delivered consistently strong alpha at a **2.0 Sharpe**, with

over 80%

market neutral returns since January 2013





After the crash in 2000

financial authorities wrote Reg FD in an attempt to get analysts to be honest

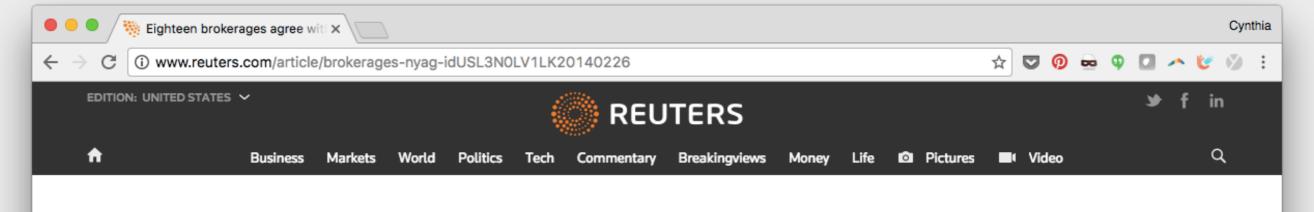
In 2013, the SEC forced 16 major quantitative hedge funds to stop collecting the #1 alpha-producing data set they ever had.

Hi John. You've told us you're an **Enterprise Tech** analyst from **Goldman**. Please rank these stocks in your coverage universe by the order in which you believe they'll perform over the coming month (by percent change).

Company	Ticker	Your Rank (1-10)
Salesforce.com Inc	CRM	?
VMware Inc	VMW	?
Adobe Systems Inc	ADBE	?
Microsoft Corp	MSFT	?
Citrix Systems Inc	CTXS	?
Oracle Corp	ORCL	?
Symantec Corp	SYMC	?
Check Point Software Technologies Ltd	CHKP	?
Red Hat Inc	RHT	?
Intuit Inc	INTU	?

Buy/Sell/Hold Ratings

- × 80% of stocks rated buy/overweight (not statistically possible)
- x Biased by corporate access & investment banking motivations
- x Prescribes no time frame
- X No specific strategy
- × Subjective, demanding a replacement heuristic
- X No persistence of accuracy across analysts



Wed Feb 26, 2014 | 1:45am EST

Eighteen brokerages agree with NY AG to stop answering analyst surveys

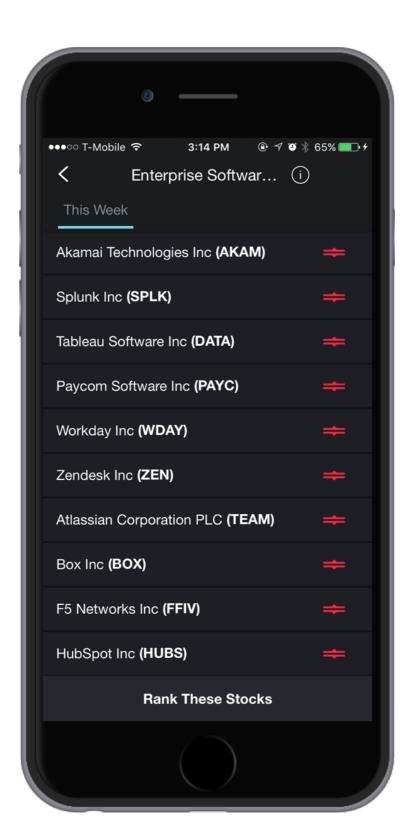
By Karen Freifeld and Chris Peters

Feb 26 Eighteen brokerages, including Goldman Sachs, JPMorgan Chase, and Citigroup, agreed to end their participation in analyst survey programs as a result of the New York Attorney General's investigation into the early release of Wall Street analyst sentiment.

The agreement with the New York Attorney General Eric Schneiderman's office comes less than two months after BlackRock Inc, the world's largest asset manager, agreed to end its analyst survey program worldwide.

At that time, the attorney general said that his investigation would continue into the firms that answered surveys.

Schneiderman had expressed concerns over brokerage firm analysts who provide answers to surveys that give traders a sneak peek into forthcoming analyst reports, a practice he referred to as "Insider Trading 2.0."





Stock Industry Group Contests ETF Contests Catalyst Contests Most Heavily US Sectors E-commerce Shorted Enterprise Software Global Index Earnings Airlines Commodities Activist Investment Banks Forex

... AND MANY MORE

Forcerank

- x 80% of stocks rated buy/overweight (not statistically possible)
- x Biased by corporate access & investment banking motivations
- x Prescribes no time frame
- x No specific strategy
- x Subjective, demanding a replacement heuristic
- X No persistence of accuracy across analysts

- ✓ Relative rank establishes clear recommendations
- ✓ Relative rank removes biases
- ✓ Prescribes a time frame
- ✓ Suggests specific strategies
- ✓ Direct question gets direct answer
- ✓ Persistence of accuracy across analysts across time

Because of the relative nature of the rankings and the specific timeframe on which competitors are predicting, creating market neutral trading strategies which rebalance weekly is relatively simple.

Consensus Ranking Long/Short

Enterprise Software (Small/Mid)

11/21 - 11/25

Rank	Ticker	Company	Consensus Rank Average of 180 User Rankings
1	SPLK	Splunk Inc	4.76
2	AKAM	Akamai Technologies Inc	5.00
3	PAYC	Paycom Software Inc	5.00
4	HUBS	HubSpot Inc	5.12
5	WDAY	Workday Inc	5.41
6	FFIV	F5 Networks Inc	5.53
7	ZEN	Zendesk Inc	5.59
8	вох	Box Inc	6.00
9	TEAM	Atlassian Corporation PLC	6.24
10	DATA	Tableau Software Inc	6.35

Consensus Ranking Movement

Enterprise Software (Small/Mid)

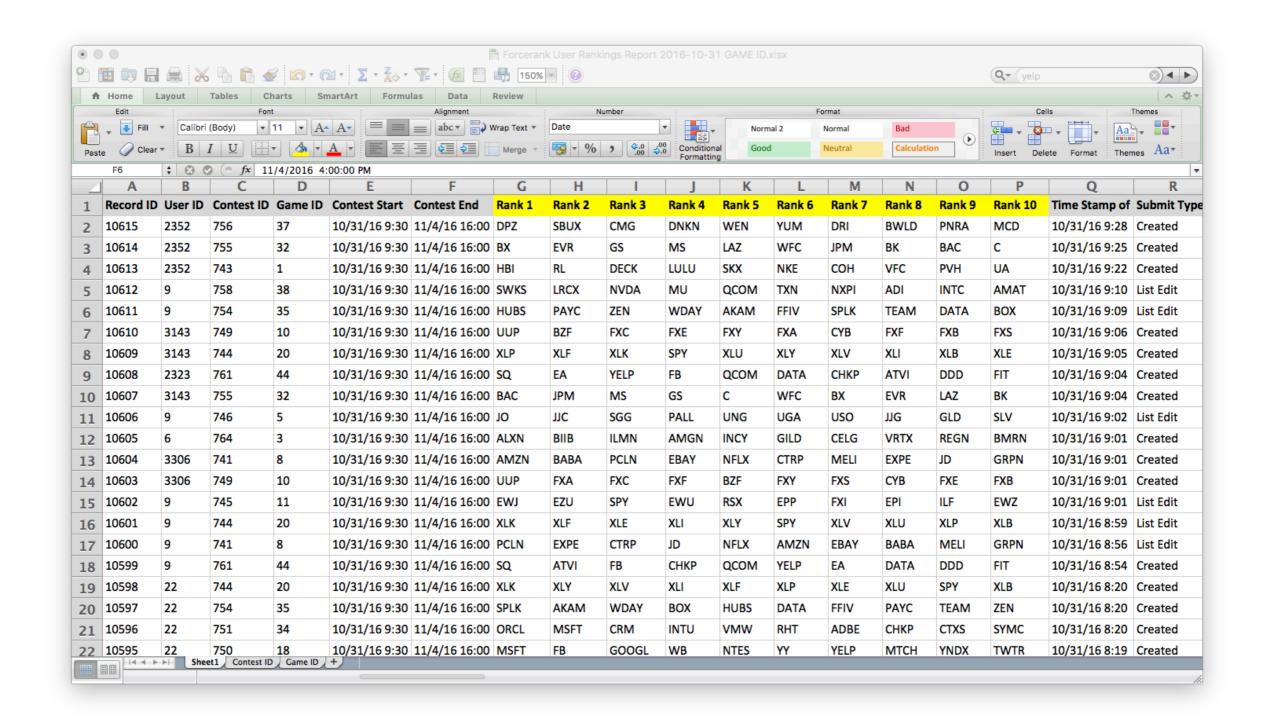
11/21 - 11/25

Ticker	Company	Rank (11/14-18)	Rank (11/21-25)	Rank Movement
SPLK	Splunk Inc	5	1	+4
AKAM	Akamai Technologies Inc	3	2	+1
PAYC	Paycom Software Inc	9	3	+6
HUBS	HubSpot Inc	1	4	-3
WDAY	Workday Inc	8	5	+3
FFIV	F5 Networks Inc	10	6	+4
ZEN	Zendesk Inc	2	7	-5
вох	Box Inc	4	8	-4
TEAM	Atlassian Corporation PLC	6	9	-3
DATA	Tableau Software Inc	7	10	-3

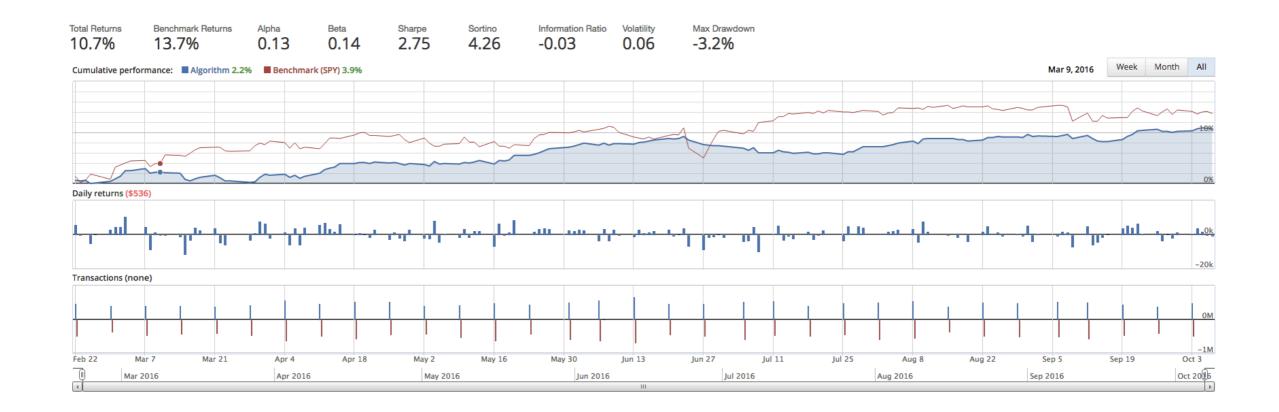
Creating A Select Consensus using the Kendal Rank Coefficient

3,000+ Analysts Weighting the Top 10% and Bottom 10%

User Rank	Analyst	Kendall Accuracy Score
1	Prasanna	0.76
2	Player_2418	0.73
3	ranko	0.72
4	Aaron	0.71
5	AZCroat	0.68
	Monster	0.19
	Player_1414	0.19
-	j_holliman	0.19
	TheWeekendWar	0.19
-	turnips	0.17
	StockDuel	0.15
	Player_2014	0.13
	Jabronnni	0.11
-	C8roddy	0.10
3496	Player_1656	-0.60
3497	NuggetZy	-0.60
3498	Player_1299	-0.60
3499	gorover18	-0.61
3500	nydavis_24	-0.62



Data is delivered at 9:30AM every Monday via FTP or API



19% annualized returns2.75 sharpe

Lessons for Building a FinTech Startup

- ✓ Go work in the industry before you start something
- ✓ Your idea is worthless, focus on validating it
- ✓ Have the right mix of co-founders, I didn't.
- ✓ Surround yourself with DNA you don't have
- ✓ Be frugal, survive long enough to see it work
- ✓ Execution is everything, great ideas die easily
- √ FinTech sucks, it's hard, but it's intellectually rewarding.

Books... they are good for you, read many of them

- ✓ Thinking Fast and Slow, Daniel Kahneman
- ✓ Misbehaving, Richard Thaler
- ✓ Reminiscences of a Stock Operator, Edwin Lefevre
- ✓ Way of the Turtle, Curtis Faith
- ▼ The Hard Thing About Hard Things, Ben Horowitz
- ▼ The Lean Startup, Eric Ries
- ✓ How to Win Friends and Influence People, Dale Carnegie