Security Analysts and Capital Market Anomalies

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"Wall Street analysts know their companies. You should cut a research report in two. The first part, the information about the company and its prospects, is probably pretty good. The second part, the recommendation, should be used as kindling. We use analyst information, but we don't use the recommendations very often." David Dreman

- Debate in the industry and academia about whether analysts research helps improve stock market efficiency or not.
- Analysts help improve stock market efficiency
 - Stickel (1992) and Womack (1996): Stock prices react strongly to analysts forecast revisions and recommendation changes.
 - Barber et al. (2001) and Jegadeesh et al. (2004): Analysts consensus recommendations (level and change) predict returns beyond existing return predictors.

- Incentive bias: investment-banking business or to curry favor with management
 - Conflicts of interest arising from affiliation with underwriting: Lin and McNichols (1998), Dechow, Hutton, and Sloan (2000), and O'Brien, McNichols, and Lin (2005); Bradshaw, Richardson, and Sloan (2006).
 - Generate trading commission (Cowen, Groysberg, and Healy 2006) or
 - Curry favor with management (Chen and Matsumoto 2006)
 - Potential external financing (Bradshaw, Richardson, and Sloan 2006)

- Behavioral bias: limited attention and overextrapolation (La Porta 1996; Hribar and McInnis 2012)
 - Analysts' expectations are sticky in the short run and underreact to persistence in firms' profitability (Bouchaud, Krueger, Landier, and Thesmar 2018)
 - Analysts are extrapolative in their long-term growth forecasts and overreact to past earnings growth (Bordalo, Gennaioli, La Porta, and Shleifer 2018)

Research questions

- Q1: Are analyst recommendations consistent with well-documented anomaly prescriptions?
- Q2: Do analysts amplify or weaken anomalies if their recommendations confirm or contradict anomaly prescriptions?

Research questions

- Why analyst recommendations?
 - O Direct measure of analysts' valuation of a stock
 - Direct guidance on investors' decision making
- Why market anomalies?
 - Well established proxies for mispricing
 - Public available information

Predictions

The sophisticated analyst hypothesis

- Analysts recommendations should on average be consistent with anomaly prescriptions.
- When analyst recommendations are contradictory to anomaly prescriptions, the anomaly stocks should not be associated with future abnormal returns.

Predictions

The biased analyst hypothesis

- Analyst recommendations are unrelated or even contradictory to anomaly prescriptions.
- When recommendations are contradictory to anomaly information ⇒ anomaly returns are amplified
 - Because some investors follow analysts blindly (Malmendier and Shanthikumar 2007; Brown, Wei, and Wermers 2014)

Preview: Recommendations

- Based on 11 prominent anomalies studied by Stambaugh et al. (2012) and Stambaugh and Yuan (2017),
- Our results broadly reject the sophisticated analysts view and more consistent with the biased analyst view

Preview: Recommendations

- Analyst recommendations are often contradictory to anomaly predictions, especially for MGMT anomalies:
 - Level: Assign more favorable recommendations to stocks classified as overvalued ranked on anomaly characteristics and vice versa
 - Change: Actively upgrade stocks in the short-leg of anomalies and vice versa

Preview: Future returns

- Anomaly returns are amplified when analyst recommendations contradict anomaly signals, especially for performance anomalies:
 - Short-leg stocks with favorable recommendations have particularly negative returns
- Other six market-based anomalies (IVOL, turnover, longrun reversal, Market beta, and max daily return): same conclusion

Preview: Mutual fund trading

- Anomaly returns are amplified when analyst recommendations contradict anomaly signals, especially for performance anomalies:
 - Short-leg stocks with favorable recommendations have particularly negative returns
- Other six market-based anomalies (IVOL, turnover, longrun reversal, Market beta, and max daily return): same conclusion

Preview: Identifying skilled analysts

- Anomalies are useful to identify skilled analysts ex-ante:
 - Analysts whose recommendations more aligned with anomaly signals are more skilled and elicit greater announcement returns

Preview: Takeaway

• Analyst recommendations are in general inconsistent with and in some cases even contradictory to anomaly prescriptions, especially for anomalies related to equity issuance and investment.

 Recommendations inconsistent with anomaly prescriptions amplify anomaly returns, especially for anomalies associated with performance

Mutual fund trading collaborates with the amplifying effect

Measures of anomalies

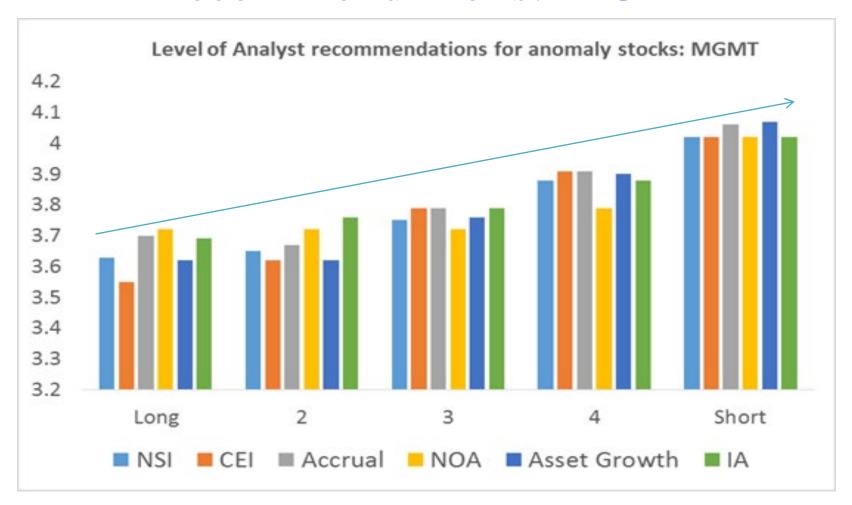
- Anomalies: Following Stambaugh and Yuan (2017), to use 11 prominent anomalies to construct two mispricing factors
 - MGMT: net stock issues (NSI), composite equity issues (CEI), accruals (Accrual), net operating assets (NOA), asset growth (AG), and investment to assets (I/A) => related to managerial decisions
 - PERF: gross profitability (GP), return on assets (ROA), momentum (MOM), distress (Distress), and O-score => related to performance
- Other six market-based anomalies: IVOL, turnover, long-run reversal, Market beta, and max daily return

Informativeness of anomaly signals

Panel C: Clust	er 1 (Alph	as)					
	MGMT	NSI	CEI	Accrual	NOA	TAG	IA
Long	0.23%	0.26%	0.32%	0.00%	0.17%	0.13%	0.07%
	(3.61)	(3.22)	(3.82)	(-0.01)	(1.84)	(1.84)	(0.86)
Short	-0.62%	-0.48%	-0.37%	-0.35%	-0.55%	-0.63%	-0.57%
	(-4.83)	(-4.88)	(-3.02)	(-2.93)	(-4.43)	(-4.84)	(-4.19)
Long - Short	0.86%	0.75%	0.68%	0.35%	0.72%	0.76%	0.64%
	(5.18)	(6.03)	(5.24)	(2.61)	(2.62)	(4.31)	(3.80)
Panel D: Clust	ter 2 (Alph	as)					
	PERF	Distress	O-score	MOM	GP	ROA	
Long	0.36%	0.37%	0.13%	0.24%	0.29%	0.32%	
	(3.85)	(3.65)	(1.33)	(1.87)	(3.04)	(3.22)	
Short	-0.63%	-0.33%	-0.31%	-0.62%	-0.18%	-0.77%	
	(-4.72)	(-2.56)	(-2.91)	(-3.02)	(-1.50)	(-5.37)	
Long - Short	0.99%	0.69%	0.45%	0.86%	0.47%	1.09%	
	(5.63)	(3.95)	(2.94)	(2.95)	(2.13)	(4.69)	

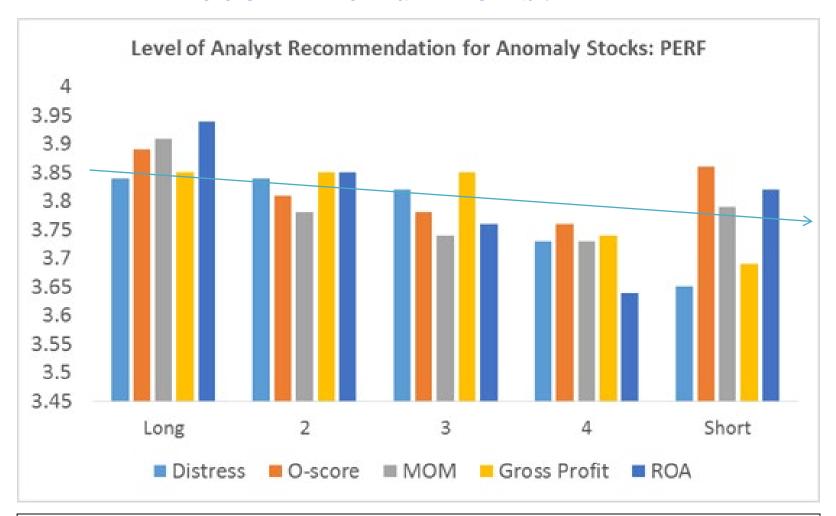
Anomalies contain valuable information about future expected returns, of which analysts should take advantage

Recommendations: MGMT



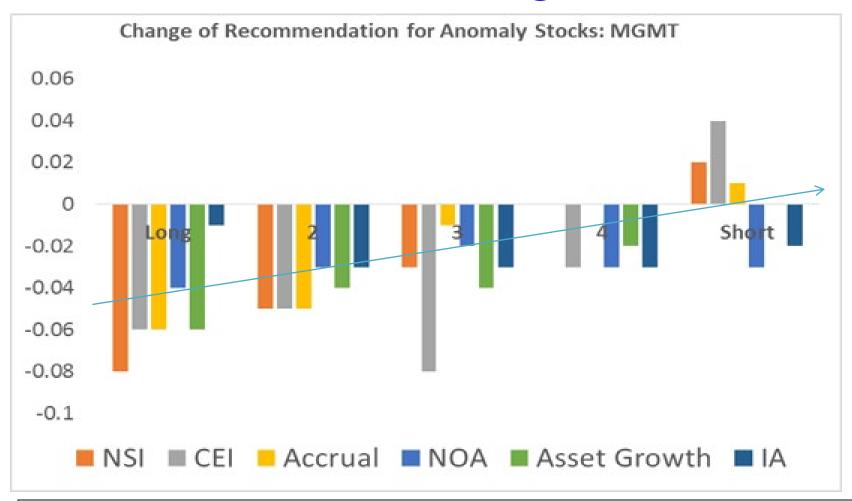
Stocks in the **short leg** of anomalies receive more **favorable** recommendations than the long leg

Recommendations: PERF



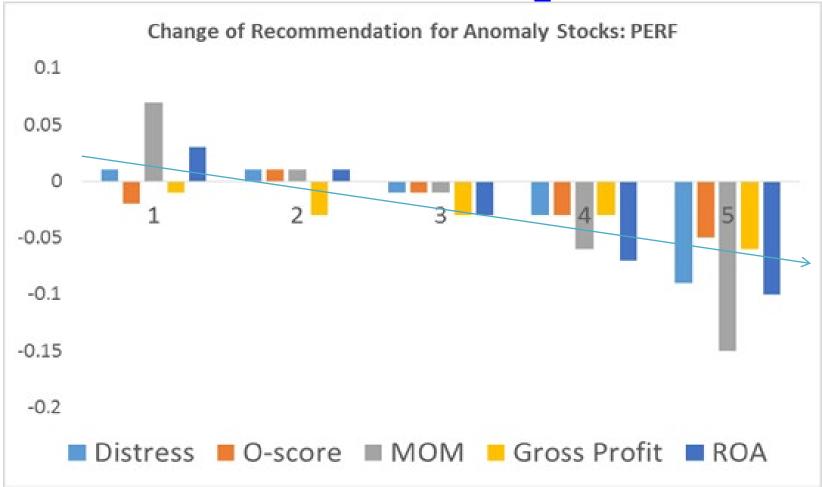
Recommendations seem to **be consistent** with performance-related anomalies, but relation is not monotonic

Recommendation changes: MGMT



Analysts actively **downgrade undervalued** stocks based on anomaly prediction, and vice versa

Recommendation changes: PERF



Analysts recommendation changes seem to be **more consistent** with performance-related anomalies

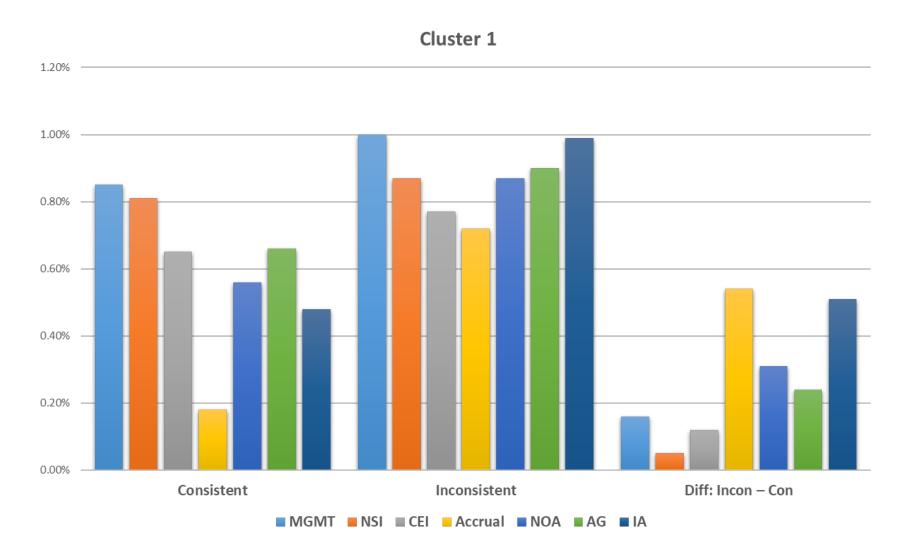
Anomaly returns conditional on recommendations

- Analysts may have superior private information such that the information content of their recommendations offset that of anomalies
 - Independent double sort on anomalies and recommendation level
 - Consistent L/S: long-leg anomaly with favorable recommendation – short-leg anomaly with unfavorable recommendation
 - Inconsistent L/S: long-leg anomaly with unfavorable recommendation short-leg with favorable recommendation
 - Difference between inconsistent and consistent L/S alphas

Anomaly returns conditional on recommendations: MGMT

Panel A: Clust	ter 1 (Fama	a-French 1	three-facto	r alphas)									
		MGMT			NSI			CEI			Accrual		
	Up	Middle	Down	Up	Middle	Down	Up	Middle	Down	Up	Middle	Down	
Long	0.40%	0.27%	0.17%	0.37%	0.32%	0.23%	0.44%	0.35%	0.27%	0.10%	-0.19%	0.07%	
	(3.09)	(1.92)	(1.87)	(3.13)	(2.19)	(1.93)	(3.11)	(2.87)	(2.32)	(0.75)	(-1.20)	(0.57)	
Short	-0.83%	-0.42%	-0.44%	-0.63%	-0.29%	-0.45%	-0.51%	-0.10%	-0.21%	-0.64%	-0.09%	-0.07%	
	(-5.20)	(-3.31)	(-3.48)	(-4.94)	(-3.08)	(-3.98)	(-4.11)	(-1.07)	(-1.80)	(-4.65)	(-0.79)	(-0.65)	
Consistent		0.85%			0.81%	o o		0.65%	, D		0.189	6	
		(4.87)			(5.30)			(3.91)			(1.00)		
Inconsistent		1.00%			0.87%			0.77%	, D		0.729	6	
		(5.07)			(4.43)			(4.38)		(3.80)			
Diff:		0.16%			0.05%	6		0.12%	o o		0.549	%	
		(0.85)			(0.29)			(0.65)			(2.34)		
		NOA			AG			IA					
	Up	Middle	Down	Up	Middle	Down	Up	Middle	Down				
Long	0.08%	0.30%	0.18%	0.22%	0.18%	0.06%	0.11%	0.02%	0.14%				
	(0.50)	(2.50)	(1.37)	(1.45)	(1.23)	(0.67)	(0.93)	(0.13)	(1.31)				
Short	-0.69%	-0.44%	-0.48%	-0.84%	-0.41%	-0.44%	-0.85%	-0.44%	-0.38%				
	(-4.21)	(-3.07)	(-3.39)	(-5.25)	(-3.53)	(-3.04)	(-5.00)	(-2.86)	(-2.21)				
Consistent		0.56%			0.66%	o o		0.48%	, D				
		(1.53)			(3.40)			(2.93)					
Inconsistent		0.87%			0.90%	o o		0.99%	Ove	r-valued	stocks	with	
		(3.21)			(4.09)			(4.54)				ndation	
Diff:		0.31%			0.24%	6		0.51%	0			nuanun	
		(1.56)			(1.22)			(2.41)	unae	<u>erperfor</u>	<u> III </u>		

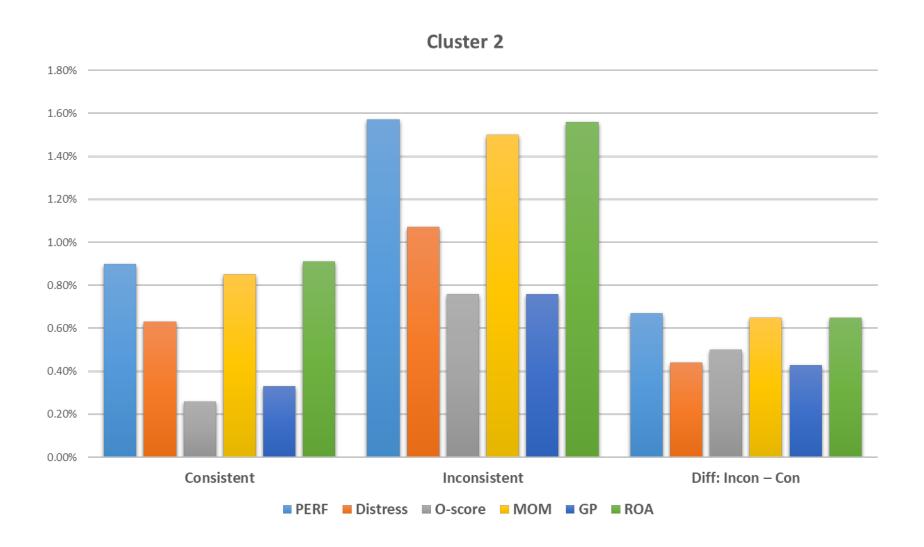
Anomaly returns conditional on recommendations: MGMT



Anomaly returns conditional on recommendations: PERF

Panel B: Cluste	er 2 (Fama	-French	three-fact	or alphas)										
		PERF			Distress				O-score				MOM	
	Up	Middle	Down	Up	Middle	Down		Up	Middle	Down		Up	Middle	Down
Long	0.40%	0.39%	0.47%	0.36%	0.21%	0.36%	(0.08%	0.15%	0.22%		0.40%	0.54%	0.41%
	(3.48)	(3.96)	(4.11)	(2.69)	(1.58)	(3.24)	((0.72)	(1.30)	(2.01)		(2.65)	(2.75)	(2.94)
Short	-1.09%	-0.54%	-0.50%	-0.71%	-0.08%	-0.27%	-	0.55%	-0.22%	-0.18%		-1.09%	-0.68%	-0.45%
	(-5.87)	(-3.42)	(-4.13)	(-4.26)	(-0.46)	(-1.84)	(-3.08)	(-1.50)	(-1.23)		(-4.87)	(-2.88)	(-2.14)
Consistent		0.90%			0.63%				0.26%				0.85%	
		(5.21)			(2.98)				(1.54)				(2.75)	
Inconsistent		1.57%			1.07%				0.76%				1.50%	
		(6.47)			(5.34)				(3.72)				(4.44)	
Diff:		0.67%			0.44%				0.50%				0.65%	
		(2.96)			(1.96)				(2.31)				(3.29)	
		GP			ROA									
	Up	Middle	Down	Up	Middle	Down								
Long	0.22%	0.34%	0.37%	0.28%	0.42%	0.49%								
	(2.10)	(2.94)	(2.69)	(2.30)	(3.72)	(3.23)								
Short	-0.39%	-0.04%	-0.11%	-1.07%	-0.70%	-0.63%								
	(-2.26)	(-0.28)	(-0.65)	(-5.79)	(-3.82)	(-4.31)								
Consistent		0.33%			0.91%									
		(1.86)			(4.34)									
Inconsistent		0.76%			1.56%			Ove	er-valu	ed stocl	KS	with		
		(2.78)			(6.65)			favo	orable	recomn	ne	endatio	n	
Diff:		0.43%			0.65%					lly und				
		(2.27)			(3.06)				~ ************		<u>-1</u>	Perior		

Anomaly returns conditional on recommendations: PERF



Fama-MacBeth regressions: MGMT

Panel A: Cluster 1							
	MGMT	NSI	CEI	Accrual	NOA	AG	IA
Long×RecUp	0.127	0.024	0.144	0.151	-0.055	0.308**	0.015
	(1.02)	(0.22)	(0.99)	(1.17)	(-0.32)	(2.34)	(0.15)
Long×RecMid	0.191	0.023	0.093	0.013	0.133	0.267	0.005
	(1.52)	(0.17)	(0.79)	(0.11)	(0.84)	(1.62)	(0.04)
Long×RecDown	0.033	0.029	-0.120	0.257*	-0.046	0.177	0.231*
	(0.34)	(0.26)	(-1.04)	(1.94)	(-0.28)	(1.37)	(1.93)
Short×RecUp	-0.810***	-0.645***	-0.330**	-0.570***	-0.660***	-0.753***	-0.755***
Short×RecUp	-0.810*** (-6.19)	-0.645*** (-4.84)	-0.330** (-2.32)	-0.570*** (-3.76)	-0.660*** (-4.97)	-0.753*** (-4.50)	-0.755*** (-4.54)
Short×RecUp Short×RecMid							
	(-6.19)	(-4.84)	(-2.32)	(-3.76)	(-4.97)	(-4.50)	(-4.54)
	(-6.19) -0.337**	(-4.84) -0.226	(-2.32) 0.089	(- 3.76) -0.027	(-4.97) -0.520***	(-4.50) -0.318*	(-4.54) -0.186
Short×RecMid	(-6.19) -0.337** (-2.19)	(-4.84) -0.226 (-1.36)	(-2.32) 0.089 (0.79)	(-3.76) -0.027 (-0.12)	(-4.97) -0.520*** (-3.68)	(-4.50) -0.318* (-1.85)	(-4.54) -0.186 (-1.01)
Short×RecMid	(-6.19) -0.337** (-2.19) -0.579***	(-4.84) -0.226 (-1.36) -0.474***	(-2.32) 0.089 (0.79) -0.326**	(-3.76) -0.027 (-0.12) -0.269*	(-4.97) -0.520*** (-3.68) -0.541***	(-4.50) -0.318* (-1.85) -0.492***	(-4.54) -0.186 (-1.01) -0.462**

Same results as in portfolio analysis: Over-valued stocks with favorable recommendation substantially underperform.

Fama-MacBeth regressions: PERF

Panel B: Cluster 2						
	PERF	Distress	O-score	MOM	GP	ROA
Long×RecUp	0.319***	0.285*	-0.003	0.413**	0.281**	0.482***
	(2.78)	(1.92)	(-0.02)	(2.24)	(2.24)	(3.80)
Long×RecMid	0.365**	0.056	0.111	0.503**	0.499**	0.602***
	(2.40)	(0.37)	(0.76)	(2.53)	(2.56)	(3.54)
Long×RecDown	0.300^{**}	0.361*	0.189	0.527**	0.487***	0.591***
	(2.18)	(1.95)	(1.59)	(2.33)	(3.28)	(3.85)
Short×RecUp	-1.041***	-0.798***	-0.474**	-0.701***	-0.537***	-0.800***
	(-4.67)	(-3.49)	(-2.57)	(-2.88)	(-2.63)	(-2.85)
Short×RecMid	-0.336**	0.062	-0.146	0.087	-0.157	-0.270
	(-1.99)	(0.32)	(-0.80)	(0.33)	(-0.74)	(-1.02)
Short×RecDown	-0.547***	-0.537***	0.032	-0.091	-0.402*	-0.268
	(-3.53)	(-3.16)	(0.21)	(-0.37)	(-1.87)	(-1.19)
Observations	661,412	359,496	522,326	616,331	673,591	691,037
Adjusted R ²	0.068	0.075	0.064	0.079	0.069	0.067

Same results as in portfolio analysis: Over-valued stocks with favorable recommendation substantially underperform.

Mutual fund net buys: MGMT

Panel A: Cluster 1 (Mutual fund n	et buys)													
		MGMT			NSI			CEI					Accrual	
	Up	Middle	Down	Up	Middle	Down		Up	Middle	Down		Up	Middle	Down
Long	1.00%	0.69%	0.47%	1.40%	0.73%	0.42%		1.31%	0.77%	0.64%		2.06%	1.24%	0.43%
	(5.06)	(5.32)	(2.86)	(5.70)	(4.67)	(2.61)		(6.92)	(14.97)	(4.60)		(11.36)	(6.31)	(1.96)
Short	3.86%	2.65%	0.91%	4.30%	2.77%	1.12%		4.27%	2.95%	1.42%		3.62%	2.20%	0.62%
	(14.04)	(13.80)	(2.93)	(20.3)	(16.76)	(3.90)		(16.46)	(13.06)	(6.56)		(14.63)	(11.42)	(1.45)
Long×RecUp - Long×RecDown		0.53%			0.98%				0.67%			1.63%		
		(2.65)			(6.00)				(3.97)			(7.65)		
Short×RecUp – Short×RecDown		2.95%			3.18%			2.84%				3.01%		
		(7.16)			(8.41)			(7.43)					(5.15)	
		NOA			AG			IA						
	Up	Middle	Down	Up	Middle	Down		Up	Middle	Down				
Long	2.59%	1.52%	0.56%	1.50%	1.06%	0.32%		2.13%	1.32%	0.52%				
	(15.69)	(13.27)	(2.52)	(9.34)	(6.05)	(1.80)		(11.48)	(6.72)	(2.53)				
Short	2.93%	1.65%	0.30%	4.00%	2.55%	0.95%		3.21%	1.87%	0.52%				
	(9.60)	(8.20)	(1.14)	(17.02)	(13.44)	(3.15)		(12.59)	(8.67)	(1.63)				
Long×RecUp – Long×RecDown		2.03%			1.18%				1.61%					
		(13.08)			(6.17)			(11.19)						
Short×RecUp – Short×RecDown		2.63%			3.05%			2.69%						
		(7.95)			(8.01)			(5.94)						

Mutual fund net buys are larger for stocks with favorable than stocks with unfavorable recommendations, especially for over-valued stocks.

Mutual fund net buys: PERF

						•								
Panel A: Cluster 2 (Mutual fund n	et buys)													
		PERF			Distress				O-score			MOM		
	Up	Middle	Down	Up	Middle	Down		Up	Middle	Down	Up	Middle	Down	
Long	2.95%	1.59%	0.95%	2.35%	1.21%	0.84%		3.12%	1.53%	0.72%	3.22%	2.15%	0.94%	
	(10.52)	(7.90)	(5.35)	(8.16)	(5.43)	(4.14)		(12.39)	(7.02)	(2.28)	(12.43)	(8.94)	(5.62)	
Short	2.23%	1.36%	0.32%	1.92%	1.47%	0.64%		2.41%	1.59%	-0.31%	2.46%	1.27%	0.39%	
	(12.19)	(8.16)	(1.83)	(11.59)	(5.51)	(2.19)		(11.21)	(6.16)	(-1.80)	(21.51)	(6.65)	(1.30)	
Long×RecUp - Long×RecDown		2.00%			1.52%			2.40%			2.28%			
		(8.13)			(8.50)			(5.26)			(11.58)			
Short×RecUp – Short×RecDown		1.91%			1.28%			2.71%			2.07%			
		(9.13)			(4.14)			(13.54)				(8.64)		
		GP			ROA									
	Up	Middle	Down	Up	Middle	Down								
Long	2.77%	1.43%	0.64%	2.99%	1.57%	0.82%								
	(12.81)	(10.57)	(2.61)	(11.07)	(7.27)	(4.73)								
Short	2.16%	1.38%	0.61%	2.56%	1.45%	0.17%								
	(13.44)	(13.03)	(3.42)	(16.88)	(6.82)	(0.79)								
Long×RecUp – Long×RecDown		2.12%			2.17%									
		(8.17)			(8.71)									
Short×RecUp – Short×RecDown		1.55%			2.39%									
		(9.97)			(11.52)									

Mutual fund net buys are larger for stocks with favorable than stocks with unfavorable recommendations.

Market reactions to skilled analysts' upward

Panel A: Upgrade reco	mmendation ch	anges (CAR[0, -	H1])			
		Cluster 1			Cluster 2	
$Corr_{MGMT}$	-0.000	0.000	-0.001			
	(-0.43)	(0.39)	(-0.53)			
$Corr_{PERF}$				0.002**	0.003**	0.004*
				(2.26)	(2.21)	(1.86)
$ \Delta Rec_{individual} $	0.003***	0.005^{***}	0.005***	0.003^{***}	0.005^{***}	0.005***
	(7.74)	(8.71)	(6.84)	(7.85)	(8.94)	(6.92)
AllStar	0.006^{***}	0.002^{**}	0.001	0.006^{***}	0.003**	0.002
	(8.77)	(2.28)	(0.94)	(8.83)	(2.42)	(1.36)
Accuracy	0.006^{***}	0.002	0.001	0.006^{***}	0.002	0.000
	(7.21)	(1.61)	(0.65)	(6.84)	(1.41)	(0.33)
Ln(FirmExp + 1)	0.000	0.000	-0.000	0.000	0.000	-0.000
	(1.29)	(0.85)	(-0.63)	(1.14)	(0.47)	(-0.38)
Ln(TotalExp + 1)	0.001***	0.001	0.002	0.001***	0.001	0.003*
	(5.21)	(1.36)	(1.49)	(5.37)	(1.52)	(1.92)
Ln(BrokerSize)	0.003***	0.002^{***}	0.002***	0.003***	0.002^{***}	0.002***
	(16.07)	(4.47)	(3.10)	(15.80)	(4.36)	(2.73)
Observations	94,046	94,046	94,046	91,545	91,545	91,545
Adjusted R ²	0.074	0.080	0.069	0.071	0.076	0.064

The market reacts much more strangely to skilled analysts' upgrade recommendation announcements for PERF anomalies.

Market reactions to skilled analysts' downward

Panel B: Downgrade re	ecommendation	changes (CAR[0,+1])			
		Cluster 1			Cluster 2	
$Corr_{MGMT}$	-0.003**	-0.004*	-0.005*			
	(-2.13)	(-1.90)	(-1.76)			
$Corr_{PERF}$				-0.005***	-0.006***	-0.007***
				(-3.34)	(-3.06)	(-2.71)
$ \Delta Rec_{individual} $	-0.008***	-0.013***	-0.014***	-0.009***	-0.013***	-0.015***
	(-11.88)	(-13.50)	(-10.30)	(-11.94)	(-13.32)	(-10.38)
AllStar	-0.009***	-0.004**	-0.002	-0.008***	-0.004**	-0.001
	(-8.18)	(-2.57)	(-0.80)	(-7.95)	(-2.41)	(-0.64)
Accuracy	-0.008***	-0.003**	-0.001	-0.008***	-0.004**	-0.002
	(-6.69)	(-2.23)	(-0.67)	(-6.90)	(-2.40)	(-0.91)
Ln(FirmExp + 1)	0.000	0.001^{***}	0.001	0.000	0.001***	0.001
	(0.76)	(3.88)	(1.40)	(0.82)	(3.60)	(0.94)
Ln(TotalExp + 1)	-0.001***	-0.003*	0.000	-0.001***	-0.002	0.001
	(-3.58)	(-1.86)	(0.22)	(-3.50)	(-1.63)	(0.40)
Ln(BrokerSize)	-0.005***	-0.002***	-0.000	-0.005***	-0.002***	-0.000
	(-16.91)	(-3.44)	(-0.50)	(-16.65)	(-3.15)	(-0.10)
Observations	111,237	111,237	111,237	111,237	111,237	111,237
Adjusted R ²	0.080	0.102	0.078	0.080	0.102	0.078

The market reacts much more strangely to skilled analysts' downgrade recommendation announcements, especially for PERF anomalies.

Alternative Explanations

- Analysts are unaware of the return predictability of these anomalies before their discoveries by academics (Mclean and Pontiff 2016)
 - Most anomalies are discovered in 1990s or early 2000s.
 - Weaker anomaly returns in the post-publication periods
 - But some are still highly significant, especially for MGMT anomalies
- The patterns of analyst recommendations are similar to those during the whole period
 - more favorable recommendations for short legs of MGMT anomalies
 - Recommendations are more consistent for PERF anomalies.

Alternative Explanations

- Analysts are reluctant to incorporate anomaly signals into their recommendations because their institutional clients face severe constraints (limits to arbitrage) when trading these stocks
 - The recommendation patterns and the amplifying effects between inconsistent and consistent recommendations are similar results between small stocks and big stocks
- Catering to institutional investors preferences for overvalued stocks (Edelen, Ince, and Kadlec 2016)
 - The recommendation patterns and the amplifying effects between inconsistent and consistent recommendations are similar results between low and high IO stocks

Alternative Explanations

- Misaligned incentives or behavioral bias?
 - Recommendations are more biased toward overvalued stocks and the amplification effect is stronger during high sentiment periods
- Overall, except for the misaligned incentives or behavioral bias explanation, our results appear to be inconsistent the above alternative explanations.

Other anomalies: Market-based anomalies

- Other six market-based anomalies: IVOL, turnover, long-run reversal, beta, and max daily return
- All generated significant abnormal returns, except Beta.
- The patterns for recommendations and the pricing effects are similar
 - Analyst recommendations are contradictory to marketbased anomaly signals.
 - The anomaly returns are amplified when analyst recommendations contradict to anomaly signals.

Reconcile with prior studies

- Reconcile with prior studies documenting investment value of analyst consensus recommendations (Jegadeesh et al., 2004; Barber et al., 2001)
 - Different results mainly are attributable to different sample periods

Conclusion

- Analysts biased recommendations could be a source of market frictions contributing to mispricing:
 - Analysts tend to make more favorable recommendations to stocks classified as overvalued (short-leg of anomaly)
 - Overvalued stocks receiving more favorable recommendations tend to earn particularly large negative returns in the future
 - Mutual funds trade aligned with recommendations
- Anomalies are useful to identify skilled analysts examte:
 - Analysts whose recommendations are more aligned with anomaly predictions are more skilled and elicit stronger recommendation announcement returns

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