

Earnings Uncertainty and Attention

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Attention Constraints

- There are limits to investor attention
- Attention constraints explain behavior in markets
 - ▶ Underreaction to Information
 - ▶ Co-movement
 - ▶ Slow Moving Capital

How Do Investors Allocate Attention?

- Market Information vs Firm-specific Information
- More attention to market information
 - ▶ Peng and Xiong (2006)
 - ▶ Reduces portfolio uncertainty the most
- More Market Timing during Recessions
 - ▶ Kacperczyk, Van Nieuwerburgh, and Veldkamp (2016)
 - ▶ Uncertainty higher during Recessions

This Paper

- Earnings Uncertainty and Attention in the Cross-section
- Hypothesis: More attention to high uncertainty stocks
 - ▶ Reduces portfolio uncertainty the most
- Opposing Claim: Less attention to high uncertainty firms
 - ▶ Processing information about these firms can be costly

Earnings Uncertainty Measures

- % of uncertainty words in 10-K and 10-Q Filings
 - ▶ Loughran and McDonald (2011) Uncertainty Word List
 - ▶ Examples: Ambiguous, Arbitrarily, Cautious, Imprecise
- Motivation: % of uncertain words in S-1 IPO filing
 - ▶ Loughran and McDonald (2013)
 - ▶ Good proxy for ex ante value uncertainty
- Also use decile ranking of earnings volatility

Future Earnings Volatility

- % UNCERTAIN predicts future earnings volatility

Variables	Future Earnings Volatility(FEVOL)			
	(1)	(2)	(3)	(4)
EVOLRANK	0.340*** (0.004)		0.222*** (0.003)	
% UNCERTAIN		0.351*** (0.025)		0.146*** (0.019)
Observations	274,316	230,226	264,768	222,007
Adjusted R-squared	0.425	0.010	0.531	0.435
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Return Volatility

- Return Volatility increases with uncertainty

Variables	Stock Volatility(CSTOCKVOL)			
	(1)	(2)	(3)	(4)
STOCKVOL	0.213*** (0.037)	0.233*** (0.045)	0.147*** (0.029)	0.146*** (0.033)
EVOLRANK	0.004*** (0.000)		0.002*** (0.000)	
% UNCERTAIN		0.008*** (0.001)		0.005*** (0.001)
Observations	278,842	232,536	269,095	224,241
Adjusted R-squared	0.072	0.052	0.144	0.133
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Attention Measures

- Google Search Activity: Retail Attention
 - ▶ Da, Engelberg, and Gao (2011)
- Bloomberg Readership: Institutional Attention
 - ▶ Ben-Rephael, Da, and Israelsen (2017)
- Abnormal Trading Volume
 - ▶ Barber and Odean (2008)
 - ▶ Hou, Xiong, and Peng (2009)

Google Search Activity

- Higher retail attention in high uncertainty firms

Variables	Abnormal Search Volume Index (ASVI)			
	(1)	(2)	(3)	(4)
EVOLRANK	0.006*** (0.002)		0.002 (0.002)	
% UNCERTAIN		0.075*** (0.015)		0.048*** (0.016)
Observations	93,228	87,136	89,257	83,326
Adjusted R-squared	0.000	0.001	0.008	0.009
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Bloomberg Readership

- Higher institutional attention in high uncertainty firms

Variables	Abnormal Institutional Attention (AIA)			
	(1)	(2)	(3)	(4)
EVOLRANK	-0.003 (0.002)		0.005*** (0.002)	
% UNCERTAIN		-0.019* (0.010)		0.016* (0.010)
Observations	23,012	22,177	21,466	20,667
Adjusted R-squared	0.000	0.000	0.147	0.149
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Trading Volume

- Higher Trading Volume in high uncertainty firms

Variables	Volume Response (AVOL [0,1])			
	(1)	(2)	(3)	(4)
EVOLRANK	0.047*** (0.003)		-0.000 (0.003)	
% UNCERTAIN		0.168*** (0.021)		0.048** (0.022)
Observations	278,755	232,468	269,015	224,178
Adjusted R-squared	0.002	0.002	0.022	0.023
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Do Attention Constraints Play a Role?

- Rational Bayesian Learning: No underreaction
- Attention Constraints: Underreaction in low attention firms
 - ▶ DellaVigna and Pollet (2009)
 - ▶ Hirshleifer et al. (2009)
- Test: Immediate and Delayed Price Response

Immediate Price Response

- Higher immediate price response in high uncertainty firms

Variables	Immediate Price Response (CAR[0,1])			
	(1)	(2)	(3)	(4)
SRANK × EVOLRANK	0.006** (0.003)		-0.000 (0.003)	
SRANK × % UNCERTAIN		0.123*** (0.019)		0.103*** (0.020)
Observations	278,842	232,536	269,095	224,241
Adjusted R-squared	0.079	0.082	0.086	0.091
Controls	No	No	Yes	Yes
Controls × SRANK	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Delayed Price Response

- Lower delayed price response in high uncertainty firms

Variables	Delayed Price Response (CAR[2,60])			
	(1)	(2)	(3)	(4)
SRANK × EVOLRANK	-0.018*** (0.006)		-0.028*** (0.007)	
SRANK × % UNCERTAIN		-0.245*** (0.047)		-0.199*** (0.048)
Observations	278,842	232,536	269,095	224,241
Adjusted R-squared	0.003	0.002	0.047	0.048
Controls	No	No	Yes	Yes
Controls × SRANK	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Analyst Response

- Faster analyst response in high uncertainty firms

Variables	On Time Revisions (ONTIME)			
	(1)	(2)	(3)	(4)
EVOLRANK	0.007*** (0.001)		0.006*** (0.001)	
% UNCERTAIN		0.153*** (0.006)		0.037*** (0.005)
Observations	144,728	123,124	140,213	119,156
Adjusted R-squared	0.002	0.020	0.217	0.208
Controls	No	No	Yes	Yes
Industry and Quarter FE	No	No	Yes	Yes

Summary

- Higher attention in High uncertainty firms
 - ▶ Higher Google Search Volume
 - ▶ Higher Bloomberg Readership
 - ▶ Higher Trading Volume
- Underreaction in Low uncertainty firms
 - ▶ Smaller immediate reaction of prices
 - ▶ Larger post earnings drift
 - ▶ Cannot be explained by rational Bayesian learning