Climate Talk in Conference Calls

Impact on Analyst Forecasts and Corporate Environmental Management

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Motivation

Firms have a preference to TALK about climate change

Green reputation and green trust (Chen (2010), Homburg et al. (2013));
 Regulatory and stakeholder pressures (Ilhan et al. (2023)); Greenwashing (Cho et al. (2013), Coen et al. (2022))



Motivation

Firms have a preference to TALK about climate change

Climate Talk: valuable information v.s. "cheap talk"

Interpretation of corporate climate talk by key stakeholders

Research Questions

- 1. What is the impact of corporate climate talk on analyst forecasting performance?
 - Information Asymmetry Theory & Impression Management Theory
 - Information gaps between executives and analysts may lead corporations to use climate talk to shape analysts' perceptions
 - analysts struggle to incorporate climate-related elements accurately into their forecasts
 - \Rightarrow H1: Executive's climate talk has a negative impact on analysts' forecasting performance.

Research Questions

- 2. Whether, and to what degree, do the analysts' climate concerns influence corporate environmental management?
 - Market discipline
 - information intermediaries between companies and investors
 - analysts' climate questions can be viewed as a reflection of societal expectations
 - \Rightarrow H2: Financial analysts climate attention have a positive impact on corporate environmental engagement.

Paper positioning

Corporate communication

- E.g., impact on corporate reputation, and stakeholder relationships (Williams & Siegel, 2017; Cho et al., 2015; Dupire & M'Zali, 2018), impact on stakeholder perceptions and the organization's legitimacy (Merkl-Davies & Brennan, 2007; Bitektine, 2011); earnings calls (Hassan et al. 2019; Hassan et al. 2020; Sautner et al. 2022)
- This paper: focuses on executives & analysts climate-related discussions

Financial analysts forecasting

- E.g., corporate disclosure and forecast accuracy (Bartov & Bodnar, 1994; Kimbrough, 2005; Kim et al., 2014); impact of environmental data on shaping analysts' forecasts (Luo et al., 2015; Cheng et al., 2014; Benlemlih et al., 2018)
- This paper: the effect of corporate climate talk on analysts forecast performance

Determinants of Environmental management

- E.g., Marquis et al., 2016; Flammer, 2021
- This paper: the impact of analysts' climate talk on corporate environmental management



Data

- Conference call Capital IQ
- Sell-side equity analysts forecast IBES
- Corporate environmental management S&P Global, Refinitiv
- Firm characteristics Compustat, CRSP

Earnings Conference calls

- Interactive & public forum
 - Executive presentation + Q&A
 - Analysts can ask questions, and investors can attend
- Dynamic and more comprehensive communication
 - Compared with press releases or SEC filings

Climate Talk

- Textual analysis on executive presentation, analyst questions, and executive answers
- 8,924 climate change-related bi-grams (e.g., carbon emissions, climate change, extreme weather, physical threats) (Sautner et al, 2023)

- Climate talk dummy: indicator equals to one if the segment (executive's presentation, analysts' question, executive's answer) contains at least one climate change bigram.
- Climate talk frequency

$$\label{eq:cc_frequency} \textit{CC_Frequency} = \frac{\text{Number of climate change bigrams}}{\text{Total bigrams count}}$$

Climate talk complexity

$$CC_Complexity = \frac{1}{N} \sum_{i=1}^{N} Gunning Fog Index(S_i)$$

- where N is the number of sentences containing a climate change bigram and S_i is the i-th sentence.
- if a segment has three sentences contain climate change bigrams with Gunning Fog Index scores of 12, 14, and 10. CC_Complexity = (12 + 14 + 10) / 3 = 12.

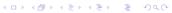
Climate talk subjectivity

$$CC_Subjectivity = \frac{1}{W} \sum_{i=1}^{W} Subjectivity(W_i)$$

- where W is the total number of words in the climate-related segment and W_i is the i-th word.
- subjectivity level of words: ranging from 0 (objective) to 1 (subjective)
- if a segment contains the words 'climate', 'is', 'important', 'for', 'future'. Using the Python Pattern library, assume the subjectivity scores are 0, 0, 0.75, 0, and 0.9 respectively. CC_Subjectivity = (0 + 0 + 0.75 + 0 + 0.9) / 5 = 0.33.
- Climate talk uncertainty

$$\label{eq:cc_uncertainty} \textit{CC_Uncertainty} = \frac{\textit{Count of Uncertainty Words in Climate-Related Discourse}}{\textit{Total Word Count}}$$

Loughran-McDonald uncertainty words



Climate Talk Positive Ratio

$$\textit{CC_RATIO_POS} = \frac{\mathsf{Count\ of\ Positive\ Words\ in\ Climate-Related\ Discourse}}{\mathsf{Total\ Word\ Count}}$$

• Climate Talk Negative Ratio

$$\textit{CC_RATIO_NEG} = \frac{\mathsf{Count\ of\ Negative\ Words\ in\ Climate-Related\ Discourse}}{\mathsf{Total\ Word\ Count}}$$

Climate Talk Sentiment

$$CC_Sentiment = CC_RATIO_POS - CC_RATIO_NEG$$

Loughran-McDonald positive and negative words



Analyst Forecast Measures

• Forecast Error: precision of analysts' predictions

$$ferror_{i,t} = |Mean of analysts' estimates_{i,t} - Actual EPS_{i,t}|$$

- Forecast Dispersion: analysts' agreement on a firm's future earnings fdispersion_{i,t} = Standard Deviation of analysts' individual forecast estimates_{i,t}
- Forecast Bias:
 - Forecast Optimism

$$\mathsf{foptimism_analyst}_{i,t} = \frac{1}{N_{i,t}} \sum_{n=1}^{N_{i,t}} (1[\mathsf{Analyst's\ forecast\ EPS}_{i,t,n} > \mathsf{Actual\ EPS}_{i,t}])$$

Forecast Pessimism

$$\mathsf{fpessimism_analyst}_{i,t} = \frac{1}{N_{i,t}} \sum_{n=1}^{N_{i,t}} (1[\mathsf{Analyst's\ forecast\ EPS}_{i,t,n} < \mathsf{Actual\ EPS}_{i,t}])$$

Corporate environmental management

- % change in total CO2 equivalent emissions (Scope 1, Scope 2, Scope 3)
- Environmental management training (dummy)
- Environmental investment initiatives (dummy)
- Environmental expenditure investment (dummy)
- Environmental innovation score
- Environmental management team score

Data & Sample

- Conference call (Executive's presentation, Analysts' questions, Executive's answers)
 - Climate talk dummy
 - Climate talk frequency
 - Climate talk tone (Subjectivity, Uncertainty, Complexity, Sentiment)
- Sell-side equity analysts forecast
 - Forecast error
 - Forecast dispersion among analysts
 - Forecast bias: optimism, pessimism
- Corporate environmental management
 - % change in total CO2 equivalent emissions (Scope 1, Scope 2, Scope 3)
 - Environmental management training (dummy)
 - Environmental investment initiatives (dummy), Environmental expenditure investment (dummy), Environmental innovation score, Environmental management team score
- Sample
 - 48,329 observations across 6,696 U.S. public firms, from 2005 to 2022

1. Corporate Climate Talk: Impact on Analyst Forecasting performance

$$\textit{Analyst Forecast}_{i,t} = \alpha_0 + \alpha_1 \textit{Pre_CC_Frequency}_{i,t-1} + \alpha_2 \textit{Controls}_{i,t-1} + \gamma_t + \lambda_s + \epsilon_{i,t},$$

- Controls_{i,t-1}: Analyst Coverage, In (firm size), Loss, FHorizon, LEV ratio, ROA, CAPX ratio, and In (firm age).
- Include both industry-fixed effect and year-fixed effect.
- The sample is clustered at both firm and year levels.

1. Corporate Climate Talk: Impact on Analyst Forecasting performance

Dependent Variable:	Ferror	Fdispersion	FOptimism_Analyst	FPessimism_Analyst	
Pre_CC_Frequency	34.864* (1.872)	30.873* (1.662)	3.068* (2.070)	-3.401** (-2.317)	
	(1.072)	(1.002)	(2.010)	(2.317)	

- Information Asymmetry Theory & Impression Management Theory
 - Information gaps between executives and analysts may lead corporations to use climate talk to shape analysts' perceptions
 - analysts struggle to incorporate climate-related elements accurately into their forecasts
 - ⇒ climate talk of executives have a negative impact on analyst forecasting performance

2. Does Analyst Climate Talk Matter? Impact on Corporate Greenness

Environmental Performance_{i,t} =
$$\alpha_0 + \alpha_1$$
 Climate Questions Tone_{i,t-1}
+ α_2 Controls_{i,t-1} + $\gamma_t + \lambda_s + \epsilon_{i,t}$,

- Environmental Performance_{i,t} includes pcg_Emission, Env Innovation Score, Env Inv Initiatives, Env Mgt Training, Env Expenditure Inv, and Env Mgt Team Score
- Climate Questions Tone_{i,t} includes q_cc_uncertainty, q_cc_ratio_pos, q_cc_ratio_neg, q_cc_subjectivity, and q_cc_complexity

2. Does Analyst Climate Talk Matter? Impact on Corporate Greenness

- Findings: Companies demonstrate improved environmental performance & management in the subsequent year when:
 - Analysts ask climate-related questions during the previous year.
 - Analysts' climate-related questions express uncertainty.
 - Analysts' climate-related questions exhibit a positive or negative sentiment.
 - Analysts' climate-related questions are **subjective**.
 - Analysts' climate-related questions are complex.
- Market discipline
 - information intermediaries between companies and investors
 - analysts' climate questions can be viewed as a reflection of societal expectations
 - ⇒ Financial analysts climate attention have a positive impact on corporate environmental engagement.

Additional Evidence

- Corporate Climate Talk and Its Influence on Analyst Attention
- Corporate Executives' Reactions to Climate-Related Questions

Corporate Climate Talk and Its Influence on Analyst Attention

$$\begin{split} \textit{Q_CC}_{i,t} &= \alpha_0 + \alpha_1 \textit{Pre_CC}_{i,t} + \alpha_2 \textit{Pre_CC_Tone}_{i,t} \\ &+ \alpha_3 \textit{Pre_CC}_{i,t} \times \textit{Pre_CC_Tone}_{i,t} + \alpha_4 \textit{Controls}_{i,t} + \gamma_t + \lambda_s + \epsilon_{i,t} \end{split}$$

- Q_CC_{i,t} (Pre_CC_{i,t}) is an indicator variable that equals one if the question (presentation) session
 includes at least one climate change bigram for firm i in year t
- Finding: Executive discussions on climate issues boost analysts' attention.

Dependent Variable: climate change in analysts' questions	(1)	(2)	(3)	(4)
Pre_CC	0.140*** (13.195)	0.094*** (7.381)	0.133*** (12.771)	0.132*** (11.849)
Pre_CC * pre_cc_subjectivity	(13.193)	0.142*** (7.190)	(12.771)	(11.049)
Pre_CC * pre_cc_ratio_pos		(**==*)	0.446** (2.286)	
Pre_CC * pre_cc_ratio_neg			(2.200)	1.323***

Corporate Executives' Reactions to Climate-Related Questions

Answers
$$Tone_{i,t} = \alpha_0 + \alpha_1 Q CC_{i,t} + \alpha_2 Controls_{i,t} + \gamma_t + \lambda_s + \epsilon_{i,t}$$

- Answers Tone_{i,t} includes answer_cc_d, A_CC_Complexity, A_CC_Subjectivity, A_CC_Uncertainty, and A_CC_Sentiment
- Q_CC_{i,t} is an indicator variable that equals one if the question session includes at least one climate change bigram.
- Finding: Executives often respond to climate-related questions with increased complexity, subjectivity and uncertainty, typically framed in a positive tone.

Dependent Variable	answer_cc_d	$A_CC_Complexity$	$A_CC_Subjectivity$	$A_CC_Uncertainty$	A_CC_Sentiment
Q_CC	0.109***	1.901***	0.061***	0.001***	0.001***

Conclusion

Summary

- Information asymmetry & impression management: Executive's climate talk has a negative impact on analysts' forecasting performance
- Market discipline & monitoring role of financial analysts: Financial analysts climate attention have a positive impact on corporate environmental engagement
- Executive's climate talk has a positive impact on analysts climate attention
- Executives tend to answer climate-related questions in a more complex, subjective, and uncertain manner, often with a positive tone.

Implications

- Analysts can act as a form of market discipline and promote corporate accountability.
- Encourage genuine climate talk to build market trust and support informed decision-making.