## Discussion of "The term structure of carbon premia" By Xia and Zulaica

Discussion by Frank Weikai Li Singapore Management University

## Summary

- Research Question: whether there is a "carbon premium" in the US corporate bond market
  - Investors require compensation to hold carbon-intensive assets that are more exposed to climate transition risk
  - The carbon premium could also arise due to investor preference for green assets
- Main Findings:
  - Bonds issued by firms with higher carbon emissions have higher yields
  - Carbon emissions affect bond yields through both the default probability and investor preference for green assets
  - The estimated carbon premium exhibits a hump-shaped term structure
- Overall, this is a well-motivated, carefully executed paper with novel insights!

## Existing Literature and Contribution

- A growing literature has examined the carbon premium in equities, debts and derivatives markets, with mixed evidence
- Equity markets
  - Bolton and Kacperczyk (JFE 2021; JF 2023): higher stock returns associated with higher levels and growth rates of carbon emissions in both US and global stock markets
  - Pastor et al. (2022): green stocks outperform brown stocks over 2011 2020
  - Aswani et al. (RF forthcoming): associations between emission level and stock return are confounded by firm size and estimated versus disclosed emissions
  - Zhang (2022): less carbon-intensive firms earn higher stock returns in US
- Debt markets
  - Duan, Li and Wen (2022): bonds issued by more carbon-intensive firms earn lower return
  - Kontz (2023): investors do not price differences in CO2 emissions of securitized auto loans
- Derivatives
  - Ilhan et al. (RFS 2020): Climate policy uncertainty is priced in the option market
- What causes the differences?
  - Different measures of carbon emissions, contemporaneous or lagged relation, inter-industry vs. intra-industry etc.

#### Major Comments 1: carbon emission level vs. intensity

• This paper uses the levels of carbon emissions as the measure of carbon risk

Our estimated model is as follows:

 $E(s_{i,j,t}) = \hat{\alpha} + \hat{\beta}_p P_{i,t} + \hat{\beta}_Z Z_{i,j,t} + \hat{\beta}_{P,Carbon} \ln(\text{Emissions}_{i,t-12}) + \widehat{FE}$ (3)

- The literature debates on whether CO2 levels or intensity better capture firms' exposure to transition risk (See the debate between BK and Aswani et al. in RF)
  - Those advocating unscaled carbon emissions argue that it is the total GHG emissions in earth's atmosphere that determines climate change
  - And climate polices are aimed at reducing total emissions
  - This argument is problematic
- A simple thought experiment
  - Imagine a world with much harsher climate policies where each firm is only allowed a fixed quota of total carbon emissions and no trade on the carbon allowance
  - Firms can circumvent the rules by spinning off certain plants and subsidiaries
  - The economy will be less concentrated with smaller average firm size, but with no material carbon emission reduction

#### Major Comments 1: carbon emission level vs. intensity

- Conceptually, using unscaled emission to measure carbon risk leads to a logical inconsistency
- Consider Firm A that produces \$100 worth of goods and emits 10 metric tons of CO2 and Firm B that produces \$50 worth of goods and emits 7 metric tons of CO2
- Your paper argue that Firm B ought to be thought of as "greener"
- However, if Firm A splits itself into two equally sized parts, each would then produce \$50 worth of goods and emit 5 metric tons of CO2—making both new firms "greener" than Firm B despite the total amount of emissions in the economy not changing!
- Moreover, if Firm A expands its production and replaces firm B, the overall economy become "greener"
- Total emissions are NOT an appropriate measure of firm-level carbon risk, even though they are the appropriate way to assess transition risk at the economy level

SMU Classification: Restricted

#### Major Comments 1: carbon emission level vs. intensity

- From the **investor preference** perspective, carbon intensity is also more often used than total emissions in practice
  - MSCI low-carbon indices
- From the econometrics perspective, total emission is highly correlated with firm size
  - Confounding the estimated coefficient on ln(Emissions)
  - Controlling for ln(Assets) is not the same as scaling due to multicollinearity
- Using unscaled emissions to measure carbon risk is analogous to using net income rather than ratio-based measures (ROA) to measure a firm's financial performance
- Based on my reading of the literature and own study, the choice of emissions level vs. intensity can dramatically affect the results!

### Major Comments 2: bond yields vs. returns

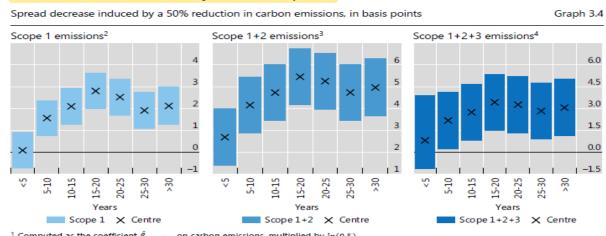
- Looking at the relation between bond yield and carbon emission cannot tell whether carbon risk is sufficiently priced or not
  - Possible that carbon risk is underpriced by financial markets
  - A key concern of financial regulators and motivation underlying climate disclosure initiatives
- Survey evidence strongly indicate that transition risk is underpriced by the financial assets
  - Krueger et al. (2020): equity valuations do not fully reflect climate risks
  - Stroebel and Wurgler (2021): 60% (67%) of participants believe climate risk is not sufficiently priced in stock (real estate) markets
- To shed light on this question, examining the relation between carbon risk and bond returns is useful
  - A negative return predictability suggests that realized climate risk is more than investors previously anticipated

## Additional Comments 1: reported vs estimated carbon emissions

- Firm-level carbon emissions reported in S&P Global Trucost is either disclosed by firms or estimated by Trucost
  - Aswani et al. (2022): vendor-estimated emissions exhibit systematic differences from firm-disclosed emissions
  - Vendor-estimated emissions are also more highly correlated with fundamental performance measures
- The weaker results using ln(scope 1+2+3 emissions) could also be due to scope 3 emissions being largely estimated by Trucost
- Suggestion: robustness test using disclosed emissions only

# Additional Comments 2: hump-shaped term structure of carbon premium

• One novel finding is the hump-shaped term structure of credit-risk adjusted carbon premium



<sup>1</sup> Computed as the coefficient  $\hat{\beta}_{P,Carbon}$  on carbon emissions, multiplied by ln(0.5). <sup>2</sup> Corresponds to model (1) in Table 3.3. <sup>3</sup> Corresponds to model (2) in Table 3.3. <sup>4</sup> Corresponds to model (3) in Table 3.3.

- ources: Bloomberg; Refinitiv; Trucost; authors' calculations.
- However, when estimating the term structure, the paper only controls for 5year ahead probability of default
  - the result could reflect differential impact of carbon risk on default probability across horizons (omitted variables)
  - Ideally the default probability should be the same horizon as the bond maturity

#### Additional Comments 3: tests on the preference channel

- This paper uses only bond price data to test the preference channel
- Preference should also manifest in investors' holdings/positions
  - Examine how carbon risk impacts ownership of bonds by investors, and control for default probability
- Preference also varies with investors' climate change beliefs/concerns
  - Geographic variation in climate beliefs (Bernstein et al. 2022)
  - Time-varying attention to climate change issues
  - Check whether the credit-risk adjusted carbon premium varies intuitively with measures of climate change beliefs