

Financial Deepening and Carbon Emissions Intensity: Evidence from a Global Sample of Countries

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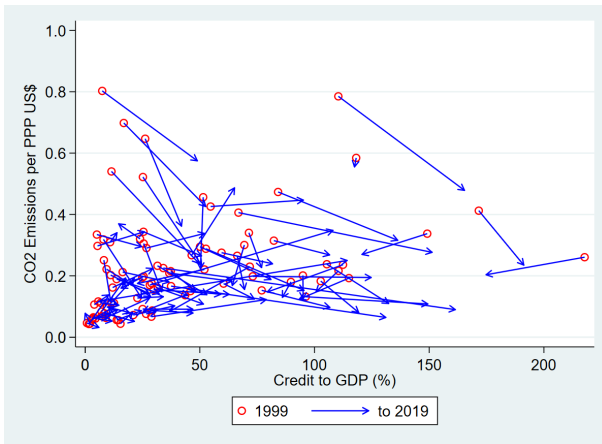
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Outline

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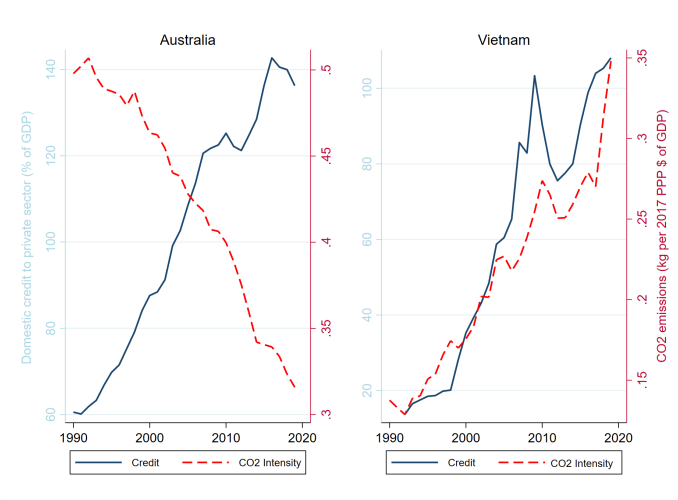
- Motivation
- Empirical Approach
- Results
- Conclusions

Credit and Carbon Around the World: 1990 vs. 2019



Source: Data from the World Bank

Credit and Carbon: *Some Examples*



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Research Question

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- **Policymakers:** Financial deepening plays a key role in facilitating economic development, and could play a crucial role in green transition.
- **Theory:** No formal theoretical model. However, several channels linking financial deepening and CO2 emissions intensity have been proposed.
- ***But there is still little empirical evidence on the effect of financial deepening on CO2 emissions intensity.***

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- ➔ Expansion in bank lending alleviates firms' financial constraints – including constraints on polluting firms (Levine et al., 2018; Goetz, 2019).

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- **Stricter climate change legislation** might force banks to take environmental risks into account when providing loans (Ongena et al., 2018).
- In a **better and stable institutional environment**, banks might be less risk averse and more likely to finance riskier newer, more innovative and carbon-efficient investments (Reghezza et al., 2022).

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Better institutional environment, controlling for the level of economic development, could thus help to effectively manage the trade-off.

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- Financial deepening increases the CO2 intensity of the economy.
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- However, more environmental regulations, a stronger rule of law, and a financial system that is relatively more market-based mitigate the positive effect of financial deepening on CO2 emissions.
- Hence, **banks tend to finance more traditional and carbon-intensive investments, but a better institutional environment seems to encourage banks to finance more innovative and greener investments.**

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- To sharpen the treatment identification, AIPW estimator of Jorda and Taylor (2016) is used in a robustness check.

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 CO2_{i,t+h} - CO2_{i,t} = & \alpha_i + \beta_1^h FD_{i,t} + \beta_{2j}^h \sum_{j=1}^2 FD_{i,t-j} + \beta_{3h}^h \sum_{h=1}^h FD_{i,t+h} \\
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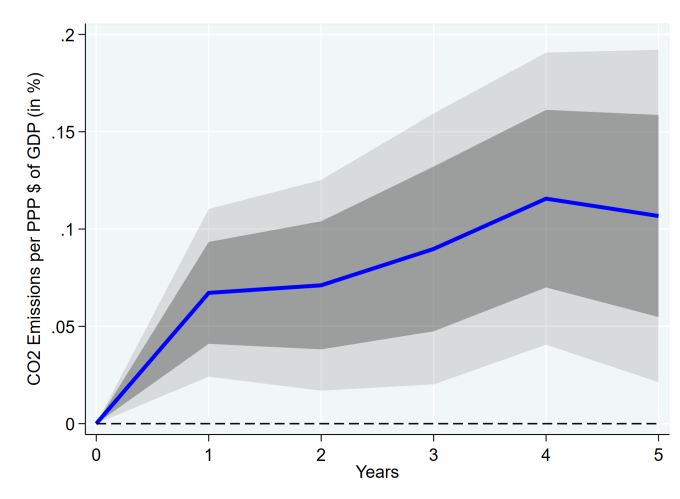
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- We then **compare the estimated impulse responses** $\{\beta_{1a}^h\}_{h=0}^H$ and $\{\beta_{1b}^h\}_{h=0}^H$ to gauge the difference in the effect of financial deepening that occurs in countries **w/o better institutions**.

Effect of Financial Deepening



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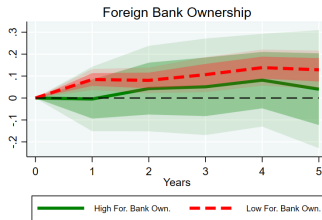
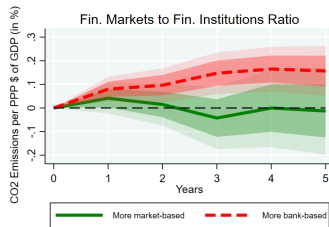
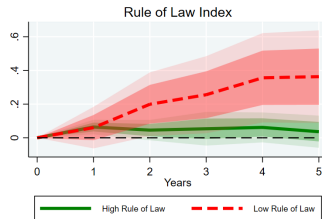
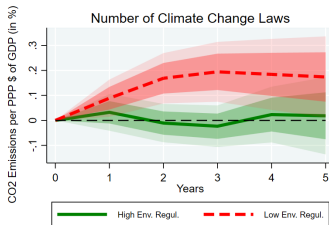
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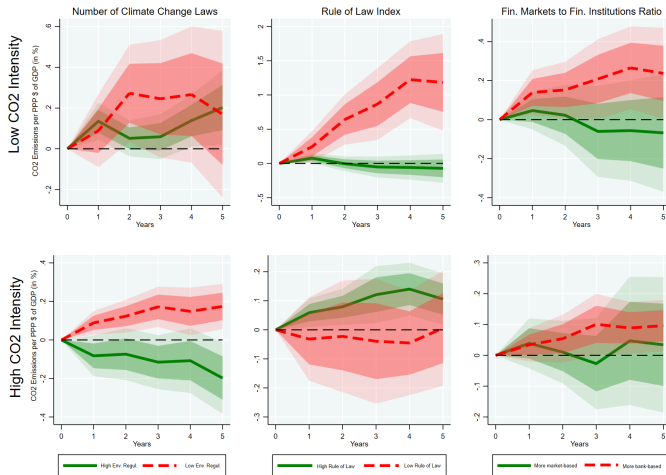
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- The presence of environmental Kuznets curve.
- Banking crises do not influence the CO2 intensity of the economy.

Effect of Financial Deepening *w/o Better Institutions*



Effect of Financial Deepening *w/o Better Institutions*: High vs. Low CO2 Intensity



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Key implications:

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- ➔ **In a better institutional environment, banks tends to finance investments in riskier and more innovative investments that are less carbon-intensive.**

Robustness Checks

- Financial Development Index of Svirydzenka (2016) ▶
- Augmented Inverse Probability Weighted (AIPW) estimator ▶
- Instrumental variables ▶
- Nickell bias and cross-sectional dependence ▶
- Panel Vector Autoregressive (PVAR) Model ▶

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While there is a trade-off in the effect of financial deepening, this trade-off can be effectively managed.

Thank you for your attention!

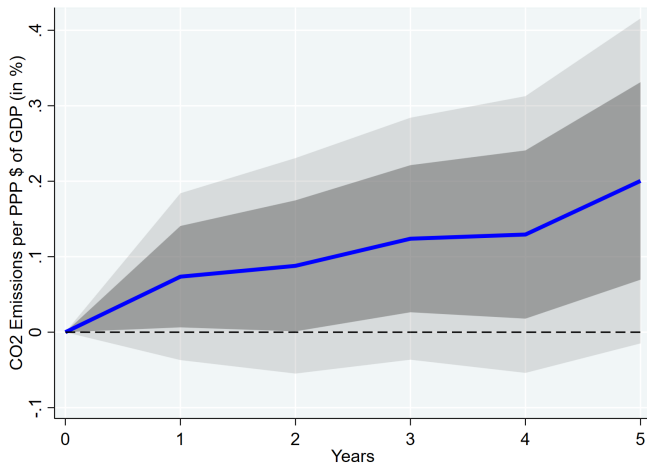
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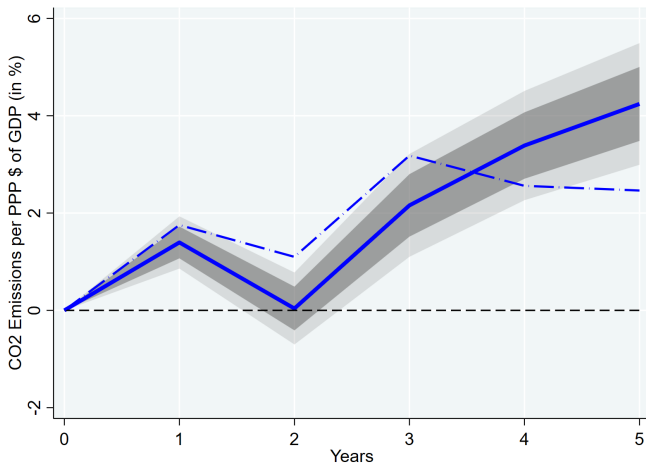
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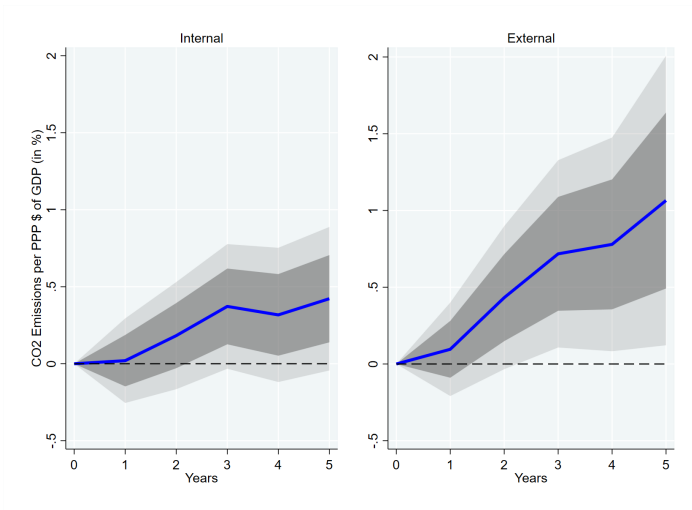
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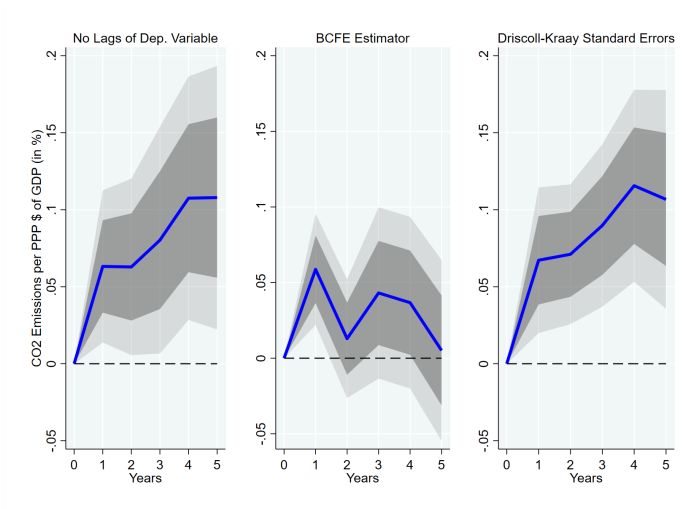
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Instrumental Variables



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