

# International Trade Finance and Learning Dynamics

David Kohn, Emiliano Luttini, Michal Szkup, Shengxing Zhang

*Discussion by Leticia Juarez*  
*University of Michigan*

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  - ▶ corporate default (Jacobson and Von Schedvin, 2015; Barrot, 2016; Amberg et al., 2021)
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**This paper → Can financial choices facilitate learning on risks in firm-level export decisions?**

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### Choice of credit arrangements:

- Characteristics of the related countries
  - ▶ Financial markets and law enforcement  
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- Long term interactions, learning and risks
  - ▶ Exporters form beliefs on type (probability of pay) of the particular importer (Antras and Foley, 2015)
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  - ▶ **This paper** → **Trade finance allows learning on risk over time**

## This paper

What is the role of trade finance on international trade?

- ① Evidence from balance sheets, production data, and transaction level customs in Chile (2015-2019)
  - ▶ Cash in advance use decreases and open account increases in relationship length (in a market)
  - ▶ Stronger effect for smaller firms, inexperienced, and exporting to risky destinations
- ② Open economy model
  - ▶ Exporters in home country monopolistically differentiated
  - ▶ Dynamic choice trade finance arrangements
  - ▶ Include learning on foreign demand and counterparty risk
- ③ Quantitative Part
  - ▶ Estimate aggregate level effects

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  - ▶ other firm-level variables: sales, costs
- New model of dynamic choice of financing and learning of different risks

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- 4 How to deal with firms that have no financing?
  - ▶ Show regressions for CIA, OA and no financing as a % of sales in that market

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- Spillovers to other destinations, and other destinations in same product.
- Data on material costs, inputs, etc reported in F29 Chilean firms might help.



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- If more data available, can also do buyer risk

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- Add interaction between seller HHI concentration Index and age
- Include HHI on the buyer side if access to firm-to-firm transaction data.

## Other small comments

- Do multinationals have more knowledge of their home country?
- How would the model results change if productivity is heterogeneous in time-market?
- Is learning heterogeneous on firm size? (Dickstein and Morales, 2018)
- Can the maturity of the trade credit be used to support the mechanism?
- Look at the first open account transaction, what are its characteristics? how is the size of transaction and maturity?

Great Paper!

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