



BANCO DE
PORTUGAL
EUROSISTEMA

11.^a CONFERÊNCIA DO BANCO DE PORTUGAL Desenvolvimento económico português no espaço europeu

14 NOV. 2022
Lisboa | Portugal



Better and Stronger? Theory and Evidence on the Effect of R&D Tax Credits on the Trajectory of Firms

Rahim Richard Jiva Lila





MOTIVATION

- Investments in R&D have seen sustained growth around the world in the past decade (OECD, 2021).
- **Many governments aim to incentivize R&D** (Jones & Williams, 2000).
- Vast literature on the effect of R&D incentives on R&D investments (see Mitchell et al., 2020; Gaillard-Ladinska et al., 2015).
- Yet, do they impact?
 - **Performance trajectory of firms** (scale, productivity)
 - **Structure of the firms** (skill, technology)
- Important implications for firms and public policies:
 - What are the returns to innovation at the firm-level?
 - What are the benefits of such incentives on productivity and scale? For policy-makers, funds are scarce and should be allocated smartly.



THIS PAPER...

1. Develops a **theoretical framework** to understand the channels through which R&D tax credits impact firm outcomes, although heterogeneously based on firm size.
2. **Empirically** assesses the causal effects of R&D tax credits using a staggered adoption differences-in-differences matching estimator (Bastos et al., 2018), leveraging data on the SIFIDE R&D tax credits program.
3. Answers the following **key questions**:
 - Do R&D tax credits lead to increased investments in R&D in supported firms?
 - How does the program concretely impact scale and productivity of supported firms? Are the effects heterogeneous based on firm size?
 - Do supported firms exhibit structural changes in terms of skill composition and technological adoption?



CONCEPTUAL FRAMEWORK

1. The model draws from standard IO assumptions.
2. Investment in R&D is characterized as a trade-off between the **use of resources** (that could have otherwise been used in production) and the **probability of innovating**.
3. **Main results of the theoretical model:**
 - R&D tax credits incentivize investments in R&D by **reducing the marginal cost** to invest in innovation.
 - Use of R&D tax credits yields differentiated results on firm performance based on the type of innovation undertaken (**product vs. process innovation**)
 - **Large firms** are more likely to engage in process innovation while **small firms** are more likely to engage in production innovation.



DATA

1. SIFIDE Dataset:

- Panel dataset that includes information on firms that received the R&D tax credits from 2006 to 2019.
- We exclude firms that were denied any support by the program.

2. Sistema de Contas Integradas das Empresas (SCIE):

- Firm-level panel dataset that includes information on firms' finances and accounting from 2004 to 2019.
- We drop observations with negative sales/production.
- We use investments in immaterial assets to proxy R&D activity (Bessone Basto et al., 2021)

3. Quadros de Pessoal (QP):

- Employer-employee matched dataset. Includes information on the workers of firms in a given year, such as experience, tenure, education, wages, etc. from 2004 to 2019.

4. Comércio Internacional (CI):

- Firm-level panel dataset that includes information on exporting firms' transactions, exporting varieties and destinations, amongst other, from 2004 to 2018.
- Use exporting product variety as a proxy for impact of the program on firm product lines.

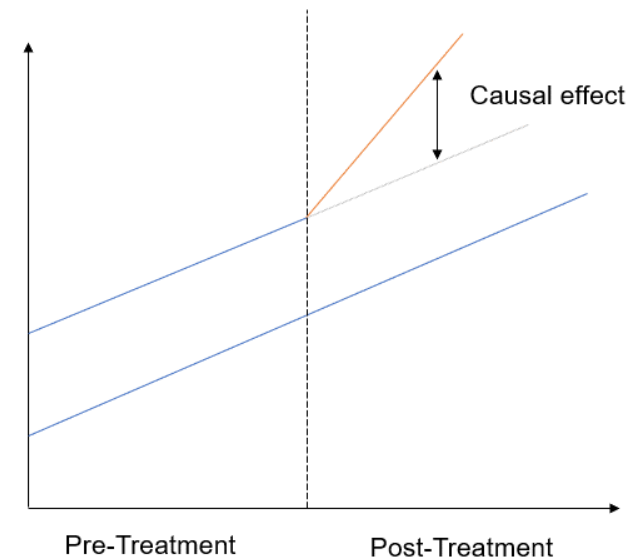
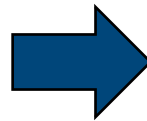
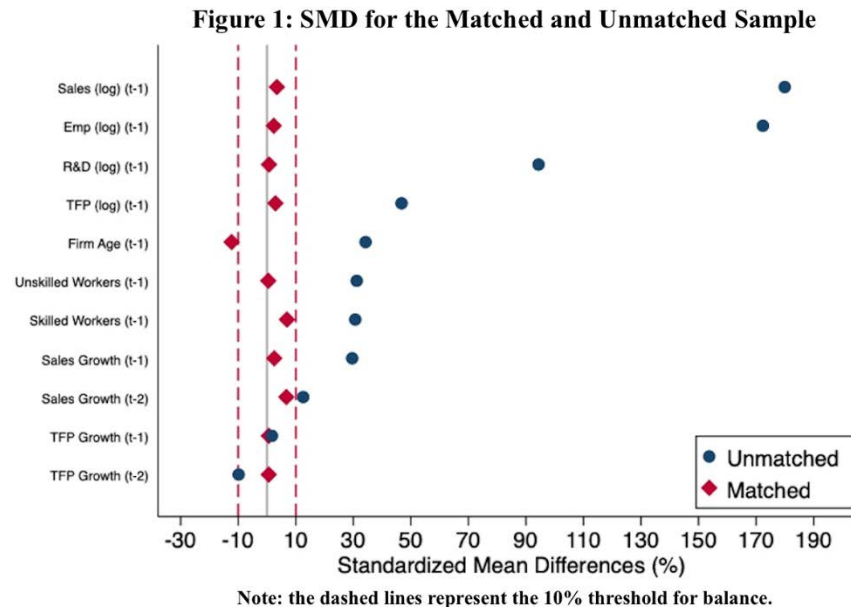
5. Inquérito a Utilização de Tecnologias de Informação e Comunicação (IUTICE):

- Survey dataset that includes information on firm-level technological adoption, from 2004 to 2019.
- Use information on various technologies to examine the effect of the program on technological adoption.



EMPIRICAL STRATEGY

- Impact assessing a policy requires a counterfactual i.e. what would happen in the absence of the R&D tax credits.
- This is challenging, especially in the absence of randomized controlled experiments, as firms who apply to the R&D tax credits program may already be very different than the firms who did not apply.
- Our approach: Matching Differences-in-Differences Estimator (Bessone Basto et al., 2021; Bastos et al., 2018)





MAIN RESULTS

1. R&D Tax Credits Boost R&D Investments

- R&D tax credits stimulate R&D investments, especially at the extensive margin.
- Creation of “new innovators”: firms that previously did not invest in R&D decided to do so because of the program.

2. R&D Tax Credits Lead to Heterogeneous Performance Effects

- Increased number of product variety and scale (sales and employment) gains amongst treated firms.
- Productivity and margins also improve amongst treated firms.
- Results are **heterogeneous based on firm size**: smaller firms see larger scale gains, while larger firms do not see increases in employment and see larger productivity and margin improvements.
- This suggests different patterns of use of the R&D tax credits based on firm size.

3. R&D Tax Credits Lead to Structural Changes in Terms of Technological Margin

- We see evidence of a skill bias in terms of the increased share of skilled to unskilled workers.
- Firms that participate to the program also tend to exhibit higher technological adoption.



KEY TAKE-AWAYS

- **Conclusion:**
 - Positive effects on R&D, especially at the extensive margin ("new innovators").
 - Positive scale and productivity gains, although differently between large and small.
 - Changes in skill composition and technological adoption confirm structural changes.
- **Implications:**
 - Program seems to reach its objectives in terms of incentivizing R&D.
 - Program particularly important to create "new innovators".
 - Effects on performance, however, depend heavily on the characteristics of firms.
- **Extensions:**
 - Undertaking a cost-benefit analysis to understand the welfare effects of the program.
 - Assessing the industry effects of the policy.
 - Assessing the effects of the policy on incentivizing exporting.
 - Understanding the effects of the policy at the worker-level.

Obrigado

