Built Like a House of Cards?

Corporate Indebtedness and Productivity Growth in the Portuguese Construction Sector¹

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Outline

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- 2. Motivation
- 3. Empirical Approach
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Backdrop - The Problem

- Productivity growth is an essential component of long-run economic growth.
- Productivity slowdown in advanced economies (Duval, Hong, and Timmer 2017):
 - Started around late 1960s;
 - Small transitory reversal during 1990s followed by renewed slowdown since early 2000s;
 - Further slowdown following the global financial crisis (GFC).
- Productivity slowdown in advanced economies is somewhat of a puzzling result - "Productivity paradox 2.0".
 - Why we're getting more innovation but less growth?
 - Why brilliant AI technologies are not leading to widespread growth and prosperity?

Backdrop - Productivity slowdown debate in a nutshell

• Mismeasurement:

• (Feldstein 2017)

Technological diffusion and business dynamism:

 (Haltiwanger 2012), (Haltiwanger, Hathaway, and Miranda 2014), (Andrews, Criscuolo, and Gal 2015)

Resource misallocation:

• (Hsieh and Klenow 2009), (Moll 2014), (Midrigan and Xu 2014), (Gopinath et al. 2017), (Schivardi, Sette, and Tabellini 2017).

• Institutional factors:

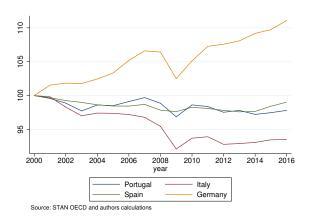
• (Nicoletti and Scarpetta 2003), (Kim and Loayza 2017), (Pellegrino and Zingales 2017).

Backdrop - What about Debt?

- What is our contribution to the debate? How did persistent debt accumulation by Portuguese construction firms impacted their long-run TFP.
- Related literature:
 - Impact of high and rising public and private debt on the macroeconomic performance of different countries:
 - (Reinhart and Rogoff 2010), (Mian and Sufi 2010), (Chudik et al. 2017).
 - Impact of debt overhang on corporate investment by southern European firms:
 - (Kalemli-Ozcan, Laeven, and Moreno 2015)
 - Impact of debt overhangs outside of crisis periods and persistent debt accumulation by firms on their long-term TFP:
 - (Anderson and Raissi 2018)

Motivation - Productivity Growth

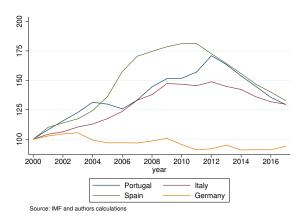
Figure 1: MFP Selected Countries, 2000=100



- Productivity growth
 has been persistently
 anemic for some
 European countries over
 the 2000-2016 period.
- This trend is particularly evident for southern
 European countries such as Italy, Spain and Portugal.

Motivation - Indebtedness Growth

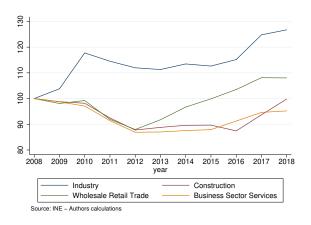
Figure 2: Corporate Debt to GDP, 2000=100



- Meanwhile, corporate indebtedness increased consistently in southern European countries.
- Portuguese corporate indebtedness peaked in 2012 but has been decreasing ever since. The same trend can be seen for Spain and Italy.

Motivation - Productivity Growth at the Sector Level

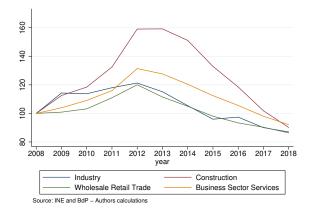
Figure 3: Labour Productivity by Sector, 2008=100



- Despite differences across sectors, Labour Productivity in Portugal has also shown signs of a slowdown.
- This effect was particularly evident in the Business Sector Services and for the Construction Sector.

Motivation - Indebtedness Growth at the Sector Level





- At the same time indebtedness levels have ratcheted up quite substantially until 2012.
- This was a common trend across sectors, but notably in the construction sector.

Empirical Approach - The Data

- Our empirical strategy relies on firm-level data sourced from Banco de Portugal's Microdata Research Laboratory (BPlim).
- Balance-sheet and icome-stament information for non-financial corporation over the period of 2006-2017.
- We relied on BPlim's harmonized version of the data set, which allows a consistent definition of variables throughout the accounting vintages.

• From this data we constructed a **balanced panel** of construction firms.

Empirical Approach - Baseline Measure of Indebtedness

 We define our baseline measure of indebtedness, DEBT, as the ratio of firms' debt to its nominal value-added.

 We define total debt as the sum of current and non-current obtained funding as reported by firms in their balance-sheet.

- We compute the nominal value-added as the difference between total output and intermediate consumption.
- This formulation is relatively unresponsive to asset price volatility or revaluation, which could contaminate our estimates.

Empirical Approach - Total Factor Productivity

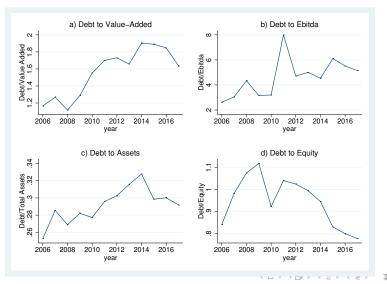
 We estimated TFP as the fitted residuals of a standard log-linearized Cobb-Douglas production function:

$$y_{i,t} = \beta_k k_{i,t} + \alpha_l I_{i,t} + u_{i,t}$$

where $y_{i,t}$ is the **log of value-added**; $k_{i,t}$ is the **log of capital** (computed through the perpetual inventory method using firms data); $l_{(i,t)}$ is the **log of labour** (number of employees) and $u_{i,t}$ is the **log of TFP**.

Empirical Approach - Measures of Firm Indebtedness

Figure 5: Different Measures of Firm Indebtedness - Balanced Panel



Empirical Approach - Firm Indebtedness by Size Class

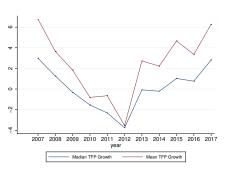
Table 1: Debt to Value Added, by Size Class (%)

	2006	2007	2008	2009	2010	2011	2012	2013	2014	2015	2016	2017
Size Class												
Micro	60.4	58.4	65.4	69.0	71.7	70.0	72.2	70.0	71.0	62.5	63.1	58.7
Small	53.3	52.3	49.2	56.2	66.2	65.7	63.7	61.9	62.5	54.5	55.0	49.6
Medium	30.8	32.4	37.5	40.2	65.8	59.0	75.8	77.8	73.7	66.3	65.8	57.4
Large	45.9	50.5	59.0	49.6	80.6	90.1	106.5	112.8	94.5	93.4	93.5	111.7

Notes: The table shows the median value of debt to added value for the balanced panel of construction firms in the period.

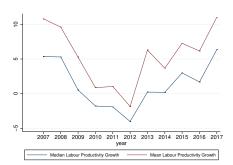
Empirical Approach - Measures of Productivity

Figure 6: Mean and Median TFP Growth



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Figure 7: Mean and median LP Growth



Empirical Approach - TFP by Size Class

Figure 8: Mean TFP Growth

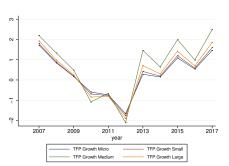
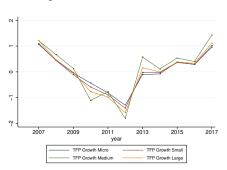


Figure 9: Median TFP Growth



Econometric Approach - Baseline ARDL and DL

• Joint dynamics of productivity growth and indebtedness:

$$\Delta TFP_{it} = \alpha_{i,y} + \delta_i \Delta TFP_{it-1} + \tau_i \Delta d_{it-1} + \varepsilon_{it}$$

$$\Delta d_{it} = \alpha_{i,d} + \rho_i \Delta d_{it-1} + \omega_i \Delta TFP_{it-1} + \varepsilon_{it}$$

• ARDL(1,1) representation of productivity growth:

$$\Delta TFP_{it} = c_i + \lambda_i \Delta TFP_{it-1} + \beta_{i0} \Delta d_{it} + \beta_{i1} \Delta d_{it-1} + u_{it}$$

 Alternatively we use a distributed lag (DL) approach to assess this effect directly:

$$\Delta TFP_{it} = c_i + \theta_i \Delta d_{it} + \sum_{l=0}^{p} \delta_{il} \Delta^2 d_{it} + v_{it}$$

Results - Baseline Specifications

Table 2: Estimates of Long-Run Effects of Corporate Indebtedness on TFP Growth

		ARDL		DL		
Lags	(1,1)	(1,2)	(2,1)	p=1	p=2	
$\hat{ heta}_{\Deltad}$	-0.054*** (0.002)	-0.056*** (0.002)	-0.045*** (0.002)	-0.135*** (0.007)	-0.139*** (0.009)	
Observations	10,940	9,846	9,846	10,940	9,846	
CD	67.667***	67.367***	68.906***	43.200***	21.470***	

For the ARDL we report PMG estimates while for the DL we report MG estimates. CD refers to test statistic for cross-sectional dependence. Standard errors are reported in parentheses. Symbols *, **, and *** denote significance at 10%, 5%, and at 1% respectively.

Results - Cross-Sectionally Augmented ARDL and DL

- Until now, we have assumed a somewhat restrictive assumption about the nature of the cross-sectional errors - we have assumed that the errors in the DEBT/TFP relationship are cross-sectionally independent.
- Factors that can lead to cross-sectional dependencies (most likely unobserved):
 - Financial crises and recession;
 - Labour and product market frictions;
 - Institutional factors and other omitted common factors.

 Both ARDL and DL specifications are augmented with cross-sectional averages (and their lags in the case of DL) of productivity and indebtedness growth.

Results - Cross-Sectionally Augmented ARDL and DL

Table 3: Estimates of Long-Run Effects of Corporate Indebtedness on TFP Growth

	CS-ARDL			CS-DL		
Lags	(1,1)	(1,2)	(2,1)	p=1	p=2	
$\hat{ heta}_{\Deltad}$	-0.060*** (0.002)	-0.037*** (0.002)	-0.044*** (0.001)	-0.145*** (0.011)	-0.192*** (0.037)	
Observations	10,940	9,846	9,846	10,940	9,846	
CD	66.753**	69.904***	69.089***	-1.296	-1.192	

For the CS-ARDL we report PMG estimates while for the CS-DL we report MG estimates. CD refers to test statistic for cross-sectional dependence. Standard errors are reported in parentheses. Symbols *, **, and *** denote significance at 10%, 5%, and at 1% respectively.

Robustness - Alternative measure of Indebtedness

Table 4: Estimates of Long-Run Effects on TFP Using Debt to Assets

		CS-ARDL	CS-DL		
Lags	(1,1)	(1,2)	(2,1)	p=1	p=2
$\hat{ heta}_{\Deltad}$	-0.022*** (0.002)	-0.065*** (0.002)	-0.532*** (0.001)	-0.047* (0.025)	-0.001 (0.198)
Observations	10,940	9,846	9,846	10,940	9,846
CD	72.402***	58.875***	60.601***	-1.417	-1.348

Notes: For all specifications, indebtedness is measured by the ratio of debt to Assets. For the CS-ARDL we report PMG estimates while for the CS-DL we report MG estimates. Symbols * , ** , and *** denote significance at 10%, 5%, and at 1% respectively.

Robustness - Alternative measure of Productivity

Table 5: Estimates of Long-Run Effects of Corporate Indebtedness on Labour Productivity

		CS-ARDL	CS-DL		
Lags	(1,1)	(1,2)	(2,1)	p=1	p=2
$\hat{ heta}_{\Delta d}$	-0.074*** (0.003)	-0.061*** (0.003)	-0.025*** (0.001)	-0.147*** (0.017)	-0.178*** (0.068)
Observations	10,940	9,846	9,846	10,940	9,846
CD	64.407***	66.622***	70.921***	-0.912	2.381**

Notes: For all specifications, indebtedness is measured by the ratio of debt to value-added and productivity by labour productivity. For the CS-ARDL we report PMG estimates while for the CS-DL we report MG estimates. CD refers to test statistic for weak cross-sectional dependence. Standard errors are reported in parentheses. Symbols *, **, and *** denote significance at 10%, 5%, and at 1% respectively.

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Preliminary Conclusions

- Our empirical approach suggests a **significant and negative relationship**, between debt accumulation and TFP growth for construction firms.
 - This result is consistent with what Anderson and Raissi (2018) found for the Italian economy.

- This result is robust to different measures of firm indebtedness as well as to various measures TFP and labour productivity.
- These results highlight the importance of policy measures that enable alternative forms of firms' financing - Flagship Program "Capitalizar" as an example.

Thank You!

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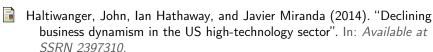


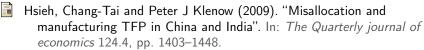
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