

Key take-aways

 Belgium does well with regard to human capital, but not with regard to human STEM capital

 Therefore, we complement the OECD's Human Side of Productivity analysis with specific information on STEM skills

 Return on human capital: elasticity of 0.20 to 0.70 for high-skilled workers and 0.20 to 0.45 for STEM workers (of any skill level), significantly higher for high-skilled STEM workers for certain types of firms

 More importantly, the elasticity for high-skilled workers decreases over time while for STEM workers this increases

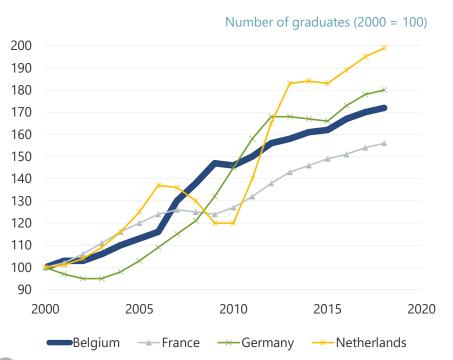
 Policy implications in light of the pandemic touch both supply and demand



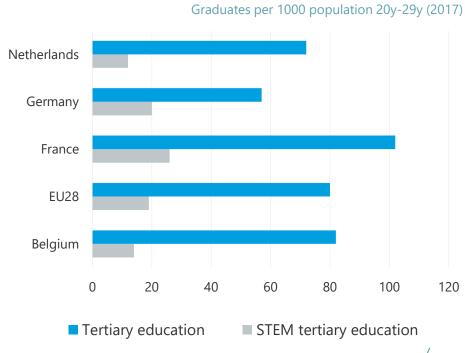


Belgium does well with regard to human capital, but not human STEM capital

Number of graduates in tertiary education increases



... but only a small share graduates in **STEM**

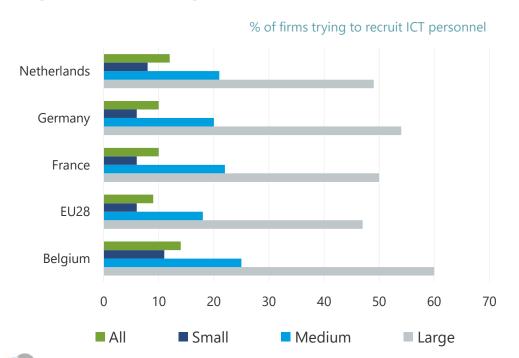




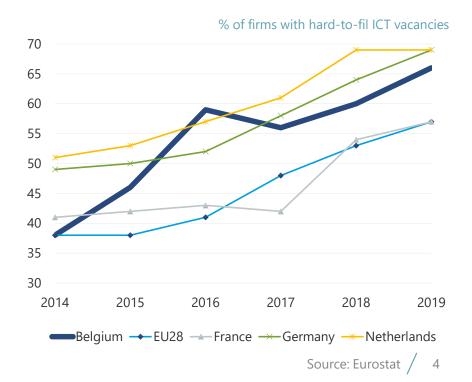
Source: Eurostat / 3

Belgium has both a high need and a shortage for ICT skills

Belgian firms (try to) recruit more ICT personnel compared to other countries



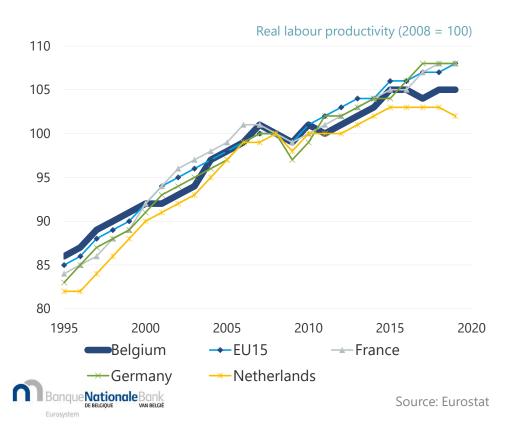
... but experience more and more difficulties finding them





In this study we look into a specific part of the productivity puzzle

Sluggish productivity growth ...



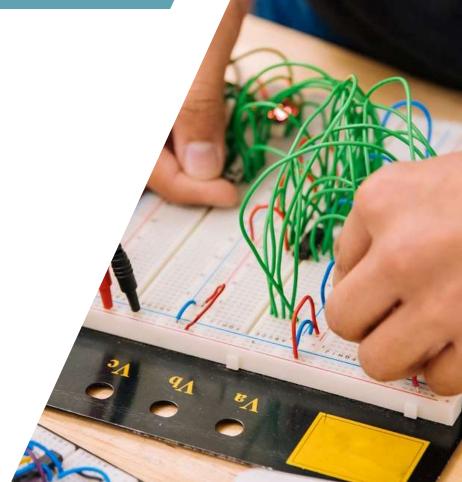
... but not for everybody

- Divergence between "best" and "rest" (Andrews et al. 2019)
- Increasing markups (De Loecker et al. 2020)
- "Superstar" firms (Autor et al. 2020)
- Role of intangible assets to benefit from new technologies (Brynjolfsson et al. 2021)



We make use of linked employer-employee data

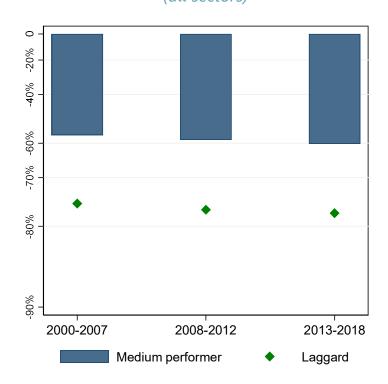
- Employee data from Crossroads Bank Social Security
 - Wage, hours worked
 - Level and field of education (ISCED 1997)
 - Nationality, gender
- Firm-level data from NBB (annual accounts + VAT)
 - Turnover, added value
 - Employees (number, FTE, hours worked)
 - Age, industry
- 2000 2018, firms > 10 employees only, ~20,000 firms and ~1,5 M workers p.a.



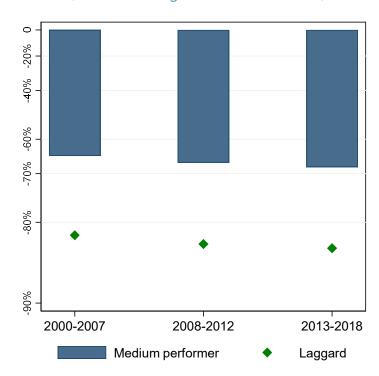


The productivity gap is significant and increasing

Productivity vs. frontier firm (all sectors)



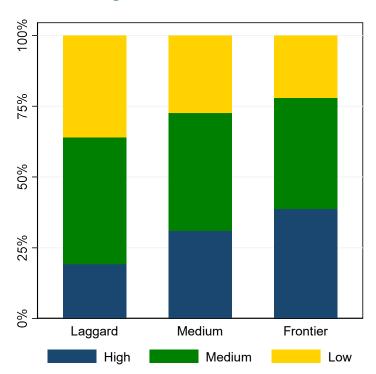
Productivity vs. frontier firm (less knowledge intensive services)



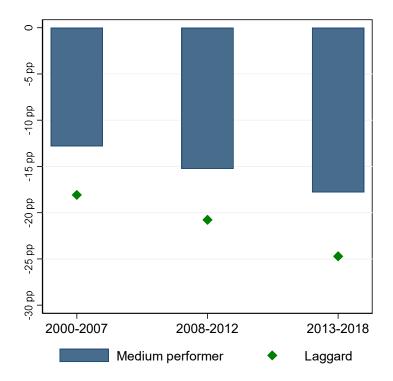


Also, the skill gap is significant and increasing

Skill profile typical firm (share of high, medium, low skilled workers)



Skill gap high-skilled workers (LKIS)* (difference in share high-skilled workers vs. frontier firm)







More skilled workers positively (and robustly) correlate with productivity

More high	(& less medium) is
	positive

more so than more medium (& less low), except KIS

with decreasing returns -

Replacing non-STEM worker by STEM (of the same skill) is positive

Source: Bijnens & Dhyne (2021)



	labor prod	labor prod	labor prod	labor prod
Share high-skilled	0.621***	0.653***	0.218*	0.720***
C	(0.021)	(0.048)	(0.093)	(0.028)
Share low-skilled	-0.310***	-0.144***	-0.360***	-0.319***
	(0.021)	(0.045)	(0.093)	(0.030)
$High \times high$	-0.308***	-0.045	0.208	-0.234*
	(0.061)	(0.236)	(0.147)	(0.101)
$High \times low$	-0.920***	0.084	-0.197	-0.871***
O	(0.114)	(0.276)	(0.330)	(0.169)
Share STEM	0.227***	0.273***	-0.041	0.390***
	(0.013)	(0.027)	(0.027)	(0.021)
Additional controls	age composition,	age composition,	age composition,	age composition
	manager/worker	manager/worker	manager/worker	manager/worke
	wage	wage	wage	wage
Industry × year FE	yes	yes	yes	yes
Firm size categories	yes	yes	yes	yes
R-squared	0.406	0.379	0.386	0.416
Number of observations	321688	65194	29312	176910

(2)

Manufacturing

(3)

KIS

(4)

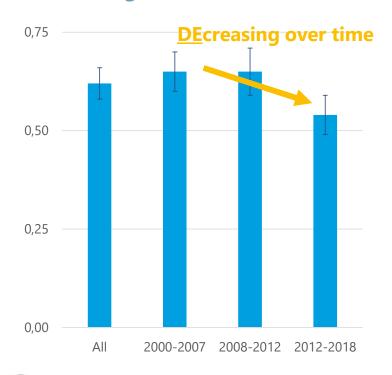
LKIS

(1)

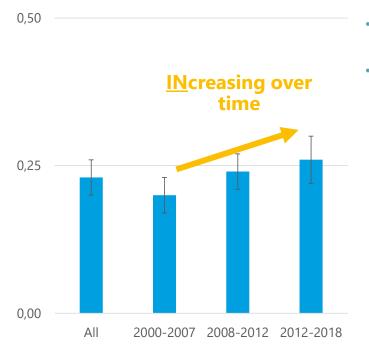
All industries

The return to high-skilled decreases over time, whilst return to STEM increases

Elasticity in function of <u>high-skilled</u> workers



Elasticity in function of STEM workers



- STEM workers refers to workers of all skill levels
- Depending on the firm skill composition and sector, the impact from adding a high-skilled STEM worker can be 4x higher than adding high-skilled non-**STEM**



Policy implications linked with both supply and demand

Supply shortages

More (STEM) graduates needed

 COVID? Increasing literature on effect of school closures, sciences might have suffered (even) more

Demand expected to keep rising

 NextGenerationEU recovery package rightfully focusses on research, innovation, and digitalization

COVID? Rapidly rising need for digitalisation of both workers and firms

 But keep in mind simple economics: stimulating demand for an elastic good results in price increases; we need more STEM workers not (only) higher STEM wages



