



**Discussion of**  
**Do R&D and ICT Affect Total Factor**  
**Productivity Differently?**  
*Harald Edquist and Magnus Henrekson*  
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# Disclaimer:



- These are my opinions and not those of the Federal Reserve Bank of Philadelphia or of the Federal Reserve System

# Overview



- How – and when – do R&D and ICT capital affect total factor productivity?
- Impacts on TFP are here called “indirect” effects, as the direct effects of these capital have already been removed in the estimation of TFP
- Briefly, the authors argue that TFP is affected contemporaneously indirectly by R&D, and with a decade long lag, indirectly by ICT



## Bottom line:

- R&D impacts are hard to capture
- More important result:
  - ICT, particularly software, appears to be a GPT, as argued by Basu and co-authors
  - Initially, there are expenses associated with adopting ICT that reduce TFP
  - In the longer run – 8+ years – there are important positive effects of ICT on TFP



## ICT



Intended to fulfill or enable the function of information processing and communications by electronic means, including transmission and display

(OECD 2009)

## R&D



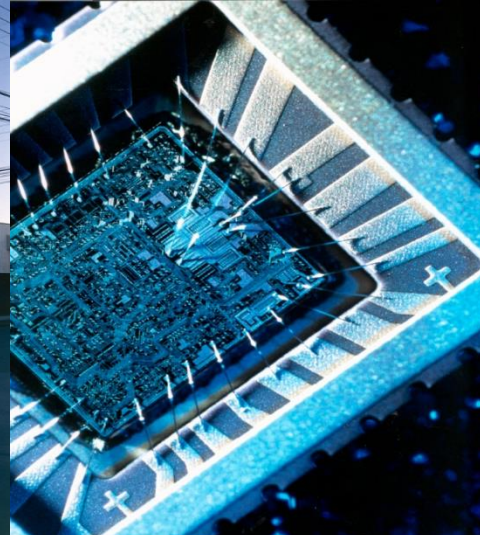
Creative work undertaken on a systematic basis in order to increase the stock of knowledge, including knowledge of man, culture and society

(OECD 2002)



# Overview

- ICT and R&D have been engines of growth
- Important to understand how investments in ICT and R&D affect productivity growth





# Questions



- Is there any evidence of indirect effects from ICT and R&D on Swedish industry level data?
- Do investments in hardware and software affect TFP differently?



# Indirect Effects

- We define indirect effects as the contribution from ICT and R&D to TFP at the industry level
  - After removing the standard direct effects
- Direct effect: Neoclassical theory predicts that ICT is a normal piece of equipment – effect on labor productivity through capital deepening
- Network effects – higher investments in ICT would result in higher TFP growth due to improved information management and more rapid diffusion of best practice

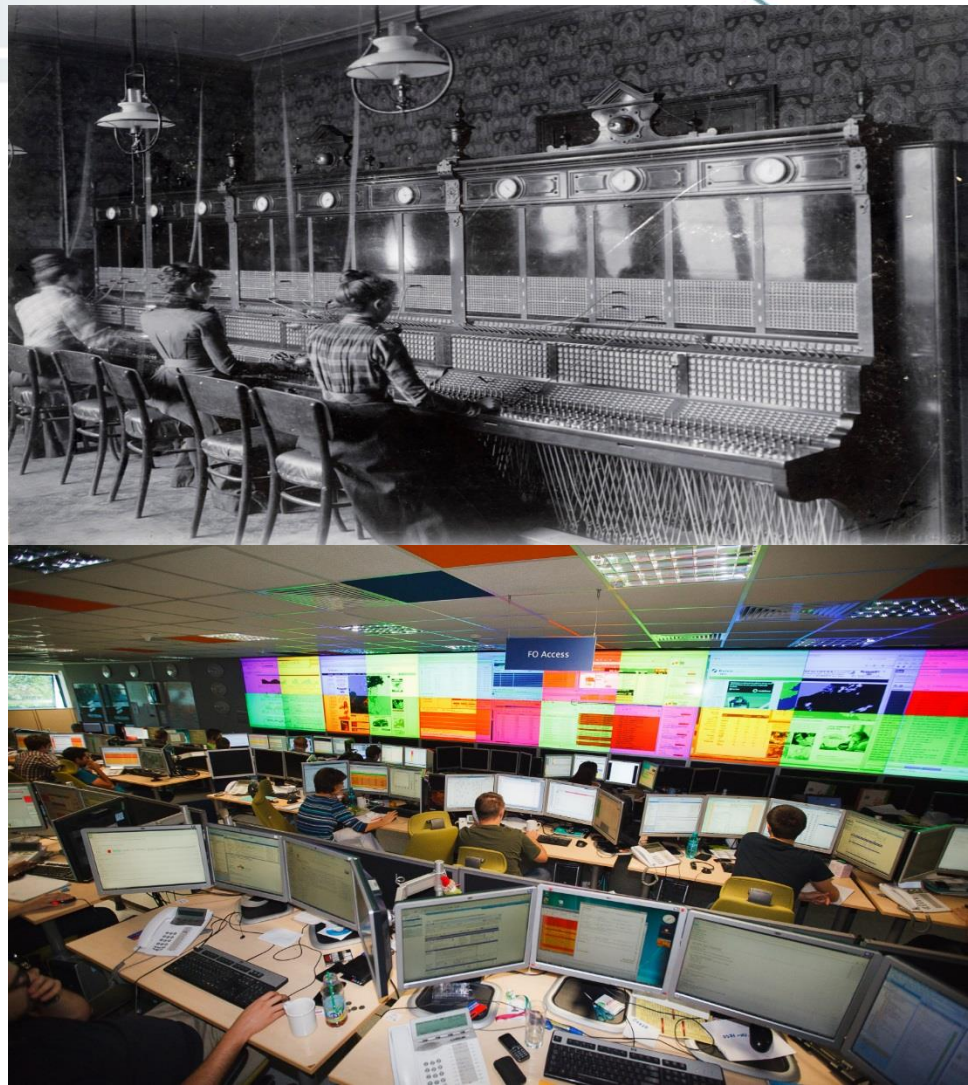






# Data

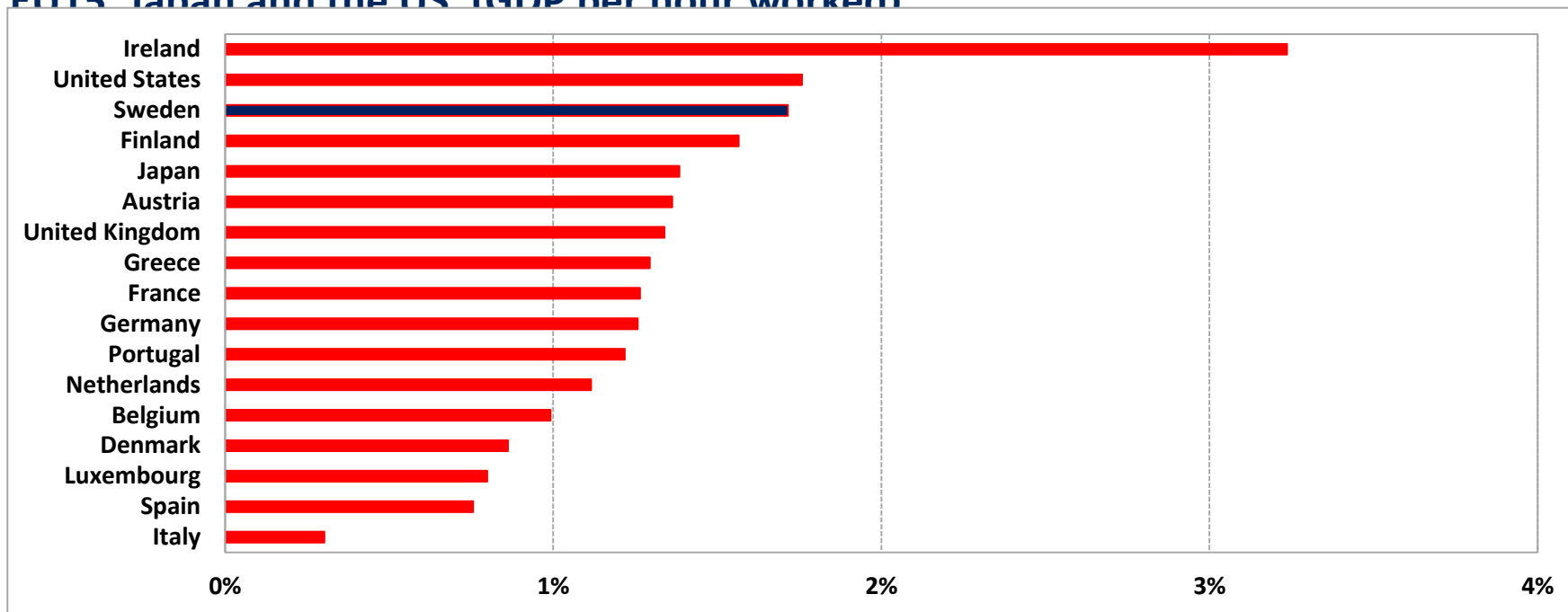
- Based on Swedish National Accounts
- 47 industries for the period 1993–2013
- Value added based on double deflation
- Labor input defined as hours worked
- Capital services have been calculated for ICT, R&D and other capital





# Annual Labor Productivity growth 1995–2014

EU15 Japan and the US (GDP per hour worked)



Source: OECD (2016).



# Estimating TFP

## Growth accounting

Assumes: Constant returns to scale and perfect markets

$$\Delta \ln TFP_{i,t} = \Delta \ln V_{i,t} - s_{ICT} \Delta \ln K_{ICT,i,t} - s_N \Delta \ln K_{O,i,t} - s_R \Delta \ln R_{i,t} - s_L \Delta \ln L_{i,t}$$

$V$  is aggregate value added,  $K_{ICT}$  is ICT capital,  $K_O$  is other capital than ICT and R&D,  $R$  is R&D capital,  $L$  is labor input measured in hours, all for industry  $i$  at time  $t$ .



# Testing for Indirect Effects

$$\Delta \ln TFP_{i,t} = \beta_{Ict} \Delta \ln K_{ICT,i,t} + \beta_O \Delta \ln K_{O,i,t} + \beta_R \Delta \ln R_{i,t} + \beta_L \Delta \ln L_{i,t} + \delta_t + v_{i,t}$$

$\Delta TFP_{i,t}$  is the TFP growth of industry  $i$ ,

$K_{ICT}$  is ICT-related capital services and  $K_O$  is capital services other than ICT and R&D,  $R$  is R&D capital,  $L$  is labor input,

$\delta_t$  are year dummies, and  $v_{i,t}$  is the differenced residual.

$$K_{ICT,i,t} = K_{S,i,t} + K_{H,i,t}$$

It is also possible to divide ICT capital into hardware and software, where  $K_{S,i,t}$  is software capital and  $K_{H,i,t}$  is computer and communications hardware capital.



# Results (I)

	Dependent variable: TFP (current)	
	Drop ICT-producing	
$\Delta$ Hours worked ( $\Delta \ln L$ )	0.08	0.08
	(0.121)	(0.121)
$\Delta$ ICT capital ( $\Delta \ln K_{ICT}$ )	-0.04	
	(0.057)	
$\Delta$ Software capital ( $\Delta \ln K_S$ )		-0.07***
		(0.021)
$\Delta$ Hardware capital ( $\Delta \ln K_H$ )		-0.02
		(0.030)
$\Delta$ Other capital ( $\Delta \ln K_O$ )	-0.35***	-0.34***
	(0.089)	(0.087)
$\Delta$ R&D capital ( $\Delta \ln R$ )	0.10***	0.10***
	(0.030)	(0.030)
Time dummies	Yes	Yes
Adjusted R <sup>2</sup>	0.10	0.10



# Lagged Indirect Effects

Instead of changing the length of the period we include lagged periods in the analysis by dividing the sample into two time periods: 1993–2003 and 2004–2013:

$$\begin{aligned} \Delta \ln TFP_i^{2004-2013} &= \beta_{ICT} \Delta \ln K_{ICT,i}^{2004-2013} + \beta_{ICT} \Delta K_{ICT,i}^{1993-2003} \beta_O \Delta \ln K_{O,t}^{2004-2013} \\ &+ \beta_R \Delta \ln R_i^{2004-2013} + \beta_R \Delta \ln R_i^{1993-2003} + \beta_L \Delta \ln L_i^{2004-2013} + u_{i,t} \end{aligned}$$



## Results (III)

	Dependent variable: TFP <sup>2004-2013</sup>	
	Base case OLS	Lag ICT and R&D (OLS)
$\Delta$ ICT capital ( $\Delta \ln K_{ICT}$ ) <sup>2004-2013</sup>	-0.11	-0.23*
	(0.135)	(0.129)
$\Delta$ ICT capital ( $\Delta \ln K_{ICT}$ ) <sup>1993-2003</sup>		0.19***
		(0.068)
$\Delta$ R&D capital ( $\Delta \ln R$ ) <sup>2004-2013</sup>	0.20**	0.18
	(0.088)	(0.148)
$\Delta$ R&D capital ( $\Delta \ln R$ ) <sup>1993-2003</sup>		0.002
		(0.185)



# Additional Robustness checks

- Measurement errors
- Omitted variable bias – other intangibles
- Simultaneity







# My comments

- Very nice paper, easy to read, very important topic, useful results!
- Highly recommended!



## Minor data issue

- Maybe adjust capital utilization for business cycle effects, as in Basu et al?
  - These are smaller for Sweden, but not nonexistent

# Comments on R&D



- R&D should have lagged effects on output
  - R&D is the creation of future products.
- Why does R&D have contemporaneous effects on TFP?
  - Reverse causation. Successful R&D causes successful firm and rivals to invest in R&D
- And why only contemporaneous effects?
  - R&D is very risky. A few big wins, many failures.
  - Economic outcomes of patents are highly skewed, lognormal
  - Difficult to catch in a regression

# Comments on ICT



- Is ICT a general purpose technology that requires time to digest? Very important question!
- Software investments may cause firms to invest in complementary resources
  - Learning the software
  - Developing macros
  - Adopting other technology to best use the software
- Over the longer-run, the investments pay off

# Congratulations



- And thank you!