Effects of automation on public finances: Does automation erode governments' tax basis? An empirical assessment of tax revenues in Europe

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This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement ns. 822330 Introduction

Background

Model & methods

Results

Concluding remarks

## Outline

#### Introduction Motivation

#### Background Background

#### Model & methods

Model & empirical strategy

#### Results

#### Concluding remarks Conclusions







Benjamin Franklin, Letter to M. Leroy (Nov. 13, 1789).



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(XFORD) イロト イラト イミト イミト ミーラへ( 3/18 Introduction

Background

Model & methods

Results

Concluding remarks

# Today: Technology has changed



Many of the tasks executed by humans at work can now be done by machines. In this paper, we ask:

What happens to taxes when automation technologies diffuse?





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

### Opinions of others

#### Robots replace jobs and undermine the tax basis

Should mass workplaces for humans disappear in the future, from a tax perspective a double negative effect could occur. On the one hand, significant tax and social security revenues would be lost, while on the other hand, the need would increase for additional state revenue to support the growing number of unemployed human workers.

Xavier Oberson 2017: "How Taxing Robots Could Help Bridge Future Revenue Gaps"





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

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#### Others contradict

"Help!" they cry, "Robots are coming for our jobs!" [...] The biggest mistake "robophobes" make when they predict higher unemployment is to omit second-order effects

Robert Atkinson 2019: "The Case Against Taxing Robots" They claim: Concerns about undermined tax basis for no reason.



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Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

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#### Our research aim

Check the empirical validity of these claims!





Introduction	Background	Model & methods	Results	Concluding remarks
000	●000	000	0000	00

What happens to the economy when automation diffuses?

#### Replacement

- Replacement of human labor by machines:
  - Negative effect on labor demand in industries where AT diffuses.
  - Ambiguous effect on wages: Negative if substituting, positive if complementing.





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

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#### Reinstatement

- Creation of new tasks/ occupations in (1) AT-adopting and (2) other industries triggered by efficiency gains :
  - Reallocation of labor within and across industries.
  - Positive effect on aggregate employment.





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### Replacement

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## Real-income

- Composite effect arising from changing price levels and factor incomes:
  - ▶ Productivity  $\uparrow \rightarrow$  prices for final goods  $\downarrow$  s.t. market competition.
  - Aggregate factor revenues from capital and labor change.





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Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

### 3 research questions:

- 1. What is the effect of AT diffusion on aggregate tax revenues at the country level in absolute terms and in relation to GDP?
- 2. What is the effect of AT diffusion on the composition of taxes by source distinguishing between taxes on labor, capital and goods?
- 3. How can these effects be traced back to the three effects through which AT impacts the structure and level of production?





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Introduction

Background

Model & methods

Results

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Concluding remarks

## The empirical reality of taxation

#### Composition of taxation in Europe in 2016

Taxes raised from different sources:

- Labor (31.6%),
- capital (35.1%),
- sales (32.5%).<sup>1</sup>

▶ Total tax revenue := 37.3% of GDP.





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

## Structure of taxation in different EU countries



The structure of taxation is measured as taxes on different sources (labor  $T^{I}$ , capital  $T^{k}$ , goods  $T^{y}$ ) as percentage share in total taxation. The subsets of Eastern, Northern and Southern European countries are defined as follows: East: C2; LT; LV; S1; and SK. North: AT; BE; DE; DK; F1; FR; IE; NL; SE; and UK. South: ES; GR; IT; and PT.



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### A stylized model of taxation

Total tax revenue in country c:

$$T_{c} = \underbrace{t_{c}^{\prime} \cdot w_{c}L_{c}}_{\text{Taxes on labor}} + \underbrace{t_{c}^{k} \cdot r_{c}K_{c}}_{T_{c}^{k}} + \underbrace{t_{c}^{y} \cdot p_{c}Q_{c}}_{T_{c}^{k}}$$
(1)

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with:

•  $L_c = \sum_{i \in I_c} L_i$ : aggr. labor as sum of labor in industries  $i \in I_c$  in c, •  $K_c = \sum_{i \in I_c} K_i$ : aggr. capital stock incl. AT tech (i.e. robots & ICT),  $\triangleright$   $p_c Q_c = \sum_{i \in I_c} p_i Q_i$ : aggr. demand,  $\triangleright$  w<sub>c</sub>, r<sub>c</sub> and p<sub>c</sub>: Wages, prices for capital and goods.



 Introduction
 Background
 Model & methods
 Results
 Concluding remarks

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## Empirical strategy

#### Major challenge

- Complexity of taxation: Macro-level tax rates  $t^{I}$ ,  $t^{k}$ ,  $t^{y}$  do not exist.
- Non-linearities from thresholds and exemptions & heterogeneity of countries.





 Introduction
 Background
 Model & methods
 Results
 Concluding remarks

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#### Solution

Step-wise procedure:

- 1. Establish link between aggregate tax data and production.
- 2. Test for the 3 effects of AT diffusion.
- 3. Explain aggregate observations wrt taxation along the 3 effects.



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Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	00

### Data & methods

We combine data from different sources:

- Tax data for labor, capital, and consumption (OECD).
- Economic data on employment, capital use, and output (EUKLEMS).
- 2 measures of automation:
  - Industrial robots.
  - ► ICT.





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	00•	0000	00

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  - ► ICT.

### Methods

- Regressions for the 3 effects + link between production & taxes.
- Industry- and country-level.
- 2 sub-periods (95-07 & 08-16); 4 Eur. regions.







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Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	•000	00

### Key observations:

### Replacement (industry level)

- ▶ Robots & depth of adoption: Labor  $\downarrow$ , wages  $\uparrow$ .
- ► ICT: No effect on wages or Labor.





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	•000	00

## Key observations:

## Replacement (industry level)

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- ► ICT: No effect on wages or Labor.

#### Reinstatement (country level)

- Robots: Wages  $\downarrow$
- ▶ ICT & depth of automation: Wages  $\uparrow$ , Labor  $\downarrow$





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	•000	00

## Key observations:

## Replacement (industry level)

- ▶ Robots & depth of adoption: Labor  $\downarrow$ , wages  $\uparrow$ .
- ► ICT: No effect on wages or Labor.

#### Reinstatement (country level)

- ▶ Robots: Wages ↓
- ▶ ICT & depth of automation: Wages  $\uparrow$ , Labor  $\downarrow$

### Real-income (country level)

- ▶ Robots: factor income (K,L,Q) & Prices ↓
- ► ICT: factor income (K,L,Q) no effect. Labor productivity ↑
- In total:
  - $\blacktriangleright$  Labor replacing tech without efficiency gains: taxes & income  $\downarrow$ 
    - Labor augmenting tech with efficiency gains: taxes ↓ but productivity↑





 Introduction
 Background
 Model & methods
 Results
 Concluding remarks

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#### 3 questions - 3 answers

- 1. What is the effect of AT diffusion on aggregate tax revenues at the country level in levels and in relation to GDP?
  - $\blacktriangleright$  Dependent on income effects of AT: If negative  $\rightarrow$  taxes  $\downarrow$
  - $\blacktriangleright$  We observed: Negative impact of robots (esp.  $\leq$  2007), but not for ICT.
  - ► Taxes in %GDP more stable, but negatively dep. on factor income share, i.e. ↓ for ICT.

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 Introduction
 Background
 Model & methods
 Results
 Concluding remarks

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### 3 questions - 3 answers

2. What is the effect of AT diffusion on the composition of tax revenues by source distinguishing between taxes on labor, capital and goods?

- ► We observed:
  - Robots: Shift from taxes on capital to taxes on goods ( $\leq$  2007).
  - ICT: Before 2007: Shift from taxes on capital to taxes on labor & after 2008: Shift from goods to capital.
- When labor & capital income ↑, taxes on labor & capital tend to ↑ & taxes on goods ↓.





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 Introduction
 Background
 Model & methods
 Results
 Concluding remarks

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### 3 questions - 3 answers

3. How can these effects be traced back to the three effects through which AT affects the structure and level of production?

- ► If replacement (at macro-level) dominates and/or wages ↓ sufficiently: Negative impact on taxes.
- We observed: Structure of taxation evolves proportionally to distribution of income across factors.
- Taxes on goods  $\downarrow$  if factor shares are higher.







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Introduction	Background	Model & methods	Results	Concluding remarks
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### Limitations and open issues

#### Limitations & (potential) ways forward:

- Tax burdens unequally distributed:
  - Poor households pay less taxes on labor and more on goods.
  - Heterogeneity among firms and profit shifting.





Introduction	Background	Model & methods	Results	Concluding remarks
000	0000	000	0000	•0

### Limitations and open issues

#### Limitations & (potential) ways forward:

- Tax burdens unequally distributed:
  - Poor households pay less taxes on labor and more on goods.
  - Heterogeneity among firms and profit shifting.
- A grain of salt: We observed extreme heterogeneity across countries and time periods.







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Introduction	Background	Model & methods	Results	Concluding remarks
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## Conclusion

Thank you for attending.





