

# Minimum wages and inequality: the effects of artificial intelligence and technological upgrading

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# Artificial intelligence and the future of work

- central policy question: effect of AI on the future of jobs
- Frey and Osborne (2017): 47% of total US emp at high risk of being automated in the next two decades
- Nedeloska and Quintini (2018, OECD): of total jobs in OECD 14% highly automatable and 32% face substantial changes
- in practice: very hard to predict
- consensus:
  - ▶ all jobs will be affected by tech change
  - ▶ content of jobs will change
  - ▶ potentially large distributional impact  
substitutability → low- and middle-skilled lose  
complementarity → highest-skilled gain

# Historical perspective on technological change

- technological change is the key driver of economic growth
  - more about this later
- and has implications for inequality
  - often biased towards certain groups of workers
    - ▶ skill biased technological change: since the 1950s supply and wages of high-skilled workers increased relative to low-skilled
    - ▶ structural transformation: since the 1850s employment and economic activity has been shifting away from agriculture to manufacturing and to services
    - ▶ occupational job polarization: since the 1980s employment share of low- and high-earning occupations have been increasing at the expense of middle-earning occupations, similar patterns for relative wages

# Job polarization and structural change

in Bárány and Siegel (2018, AEJ Macro & 2018, wp) we show that

- job polarization started in the 1950s in the US
- coincides with start of structural shift away from manufacturing
- significant part of occupational employment share and relative wage change driven by between industry forces
- show that routine employment contracted only in goods, and vice versa

⇒ two phenomena closely linked

→ what type of technological change is driving these patterns of emp reallocation across sec and occ?

important for policy: active labor market vs industrial policies

# Sources of recent technological change I.

in Bárány and Siegel (2018, wp) we

- propose a model where tech evolves at the sec-occ cell level
  - allows us to quantify the bias of tech across sec-occ cells
- decompose it into diff components
- ▶ sector and occupation components jointly explain almost 75%
  - ▶ general purpose technologies (TFP) hardly explain anything
  - ▶ most is explained by occupation specific growth
  - ▶ some role for sector specific growth
- ⇒ most of the employment reallocations and part of the faster prod growth in goods are due to occ-specific tech change
- ⇒ heterogeneity across occupations is more important than across sectors for employment changes (and for aggregate and industrial productivity growth)

# Sources of recent technological change II.

Aum, Lee and Shin (2018, wp)

- do industrial linkages overturn this conclusion?
- model: computer capital is used in all industries
- prod improvement in comp ind spills over to other ind
- ⇒ computer ind's prod growth explains third of aggregate growth
- ⇒ routinization leads to aggregate prod drop
- ⇒ these two cancel out perfectly until mid-2000s, after which agg prod slowdown driven by comp ind slowdown
- ⇒ occ heterogeneity is more important, but certain industries may have a large role

going forward:

- ① role of other industries, such as AI
- ② role of linkages, complete input-output structure
- ③ where is tech change coming from?

# The effects of technological progress I.

- first-round effects: jobs where humans will be displaced by technology
- focus on losers who are often concentrated and visible
- a lot of the analysis misses the gainers
- besides distributional impacts, large positive effect on all consumers
- technology is the source of sustained improvement in living standards for everyone
- new tech adopted to lower costs  $\Rightarrow$  prices fall  $\Rightarrow$  more disposable income  $\Rightarrow$  higher demand for goods and serv  $\Rightarrow$  higher labor demand
- GE effects are important  
partially offset the reduction in demand for certain types of labor

# The effects of technological progress II.

- empirical literature typically unable to assess GE effects, typically compares differentially impacted occupations/workers
- Caselli and Manning (2018, wp)
  - ▶ if labor is the only production input in fixed supply
  - ▶ then new, productivity increasing technologies
  - ▶ increase average wages in the long run
  - ▶ as long as the relative price of investment falls

⇒ the average worker likely to benefit from new technologies

- intuition: there must be some gainers from new tech  
labor is the fixed factor of production, and the gains go to the fixed factor
- main caveat: imperfect competition and increasing mark-ups
  - ▶ competition in product and labor markets
  - ▶ increased privatization of knowledge
- does not rule out substantial distributive effect and no predictions about transition



# Is AI fundamentally different?

- probably no, but
  - but there is some evidence that tech change is becoming more and more specific to occupations rather than to industries
- all similar occ affected approx at the same time
- labor market and individual workers have less time to adjust
- is policy needed?

# Evidence on the effect of automatability

Frey-Osborne framework: Can the tasks of this job be sufficiently specified, conditional on the availability of big data, to be performed by state-of-the-art computer-controlled equipment?

	$\Delta \log \text{ emp}$	$\Delta \log \text{ emp}$	$\Delta \log \text{ emp}$	$\Delta \log \text{ wage}$
period	00-11	00-04	12-17	12-17
prob of auto	-0.036 (0.004)	-0.033 (0.006)	-0.018 (0.004)	0.003 (0.001)
$R^2$	0.069	0.026	0.016	0.067

- those with higher prob of auto have slower emp growth, but very small impact, decadal  $\Delta$  10th percentile -22%, 90th 53%
- very poor explanatory power
- better predictor earlier than in more recent years
- wages are increasing, but even smaller impact

data: US Occupational Employment Survey

# Some facts about labor market adjustments

- suggestive evidence about the supply of labor to occupations:  
1980-2012  $\Delta$  in log employment and  $\Delta$  log wages
  - ▶ small, marginally significant relationship [▶ graph](#)
  - very elastic supply in the long run
- huge changes in employment shares and modest changes in relative wages over long periods
- occupational mobility
  - ▶ gross flows much larger across occ than net flows
  - ▶ high churning of individuals across occupations  
20% of workers in the UK change occupations each year
- minimum wages
  - ▶ studies focus on short run & effects on teenagers
  - ▶ very small neg or no emp effect
  - min wages improve welfare of lowest earners

# Minimum wages in general equilibrium

in Bárány (2016, JOLE) I show that

- need to look at longer run & GE effects
  - if min wages impact the rel wages of different types of workers
  - and these types are endogenous
- change incentives of people to sort into these types and
- change incentives of firms to dev/adopt technologies for types
- ⇒ not only the lowest end, but entire distr of wages affected
- if types = occupations and technologies = automate tasks
- min wages induce firms to automate tasks and replace workers most impacted by min wage

# The effect of minimum wages on automatable jobs

Lordan and Neumark (2017, NBER wp)

- effect of min wages on low-skilled workers in automatable jobs
  - easier to substitute by machines than other jobs
- min wage  $\Rightarrow$  inv by firms to implement such substitutions
- analyze CPS data 1980-2015: increases in min wage
    - ▶ decreases automatable emp of low-skilled workers
    - ▶ increases likelihood of non-emp or emp in worse jobs
    - ▶ negative effect is heterogeneous
      - largest impact on older & manufact, female and black workers
      - larger later on in the sample
- ⇒ adverse effects of min wages
- does not imply min wages should be scrapped, but monitoring needed

# The role of education and other policies

hard to predict affected occupations/industries

- Autor and Dorn (2013): taxi drivers, cashiers, bricklayers, fruit pickers all non-routine
- current investments: Uber and driverless cars, Amazon GO, Fastbrick, Ocado

for current cohorts facing large changes

- retraining people facing difficulties: most vulnerable low-skilled workers least likely to participate
- minimum wages: good for wages, bad for employment
- redistribution

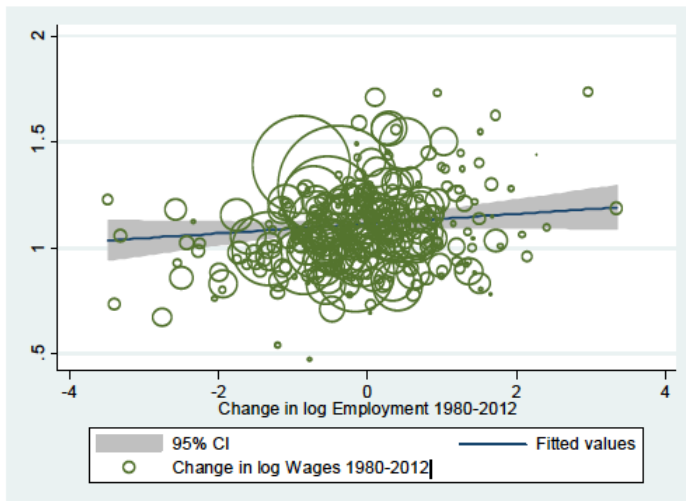
for incoming cohorts

- more higher educ: might be costly and likely small impact due to GE effects
- Autor (2015,JEP): expertise, judgement, creativity needed
- improving primary & secondary educ: reading, math, analytical reasoning, communication, and teamwork

# Policies for inclusive growth

- promote technological progress
  - ▶ knowledge drives technology, knowledge is a public good
  - ▶ markets might be inefficient at providing this public good
- monitor competitiveness of product and labor market
- for older cohorts
  - ▶ redistribute more actively
- for incoming cohorts
  - ▶ teaching of basic skills should be improved: reading, math, analytical reasoning, communication and teamwork

# Relation between $\Delta$ employment and $\Delta$ wages



► back