

# The Elasticity of Aggregate Output with Respect to Labor and Capital

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# Research questions

- What are the elasticities of GDP with respect to capital and labor?
- Have those elasticities changed over time?
- Are those elasticities similar across countries?

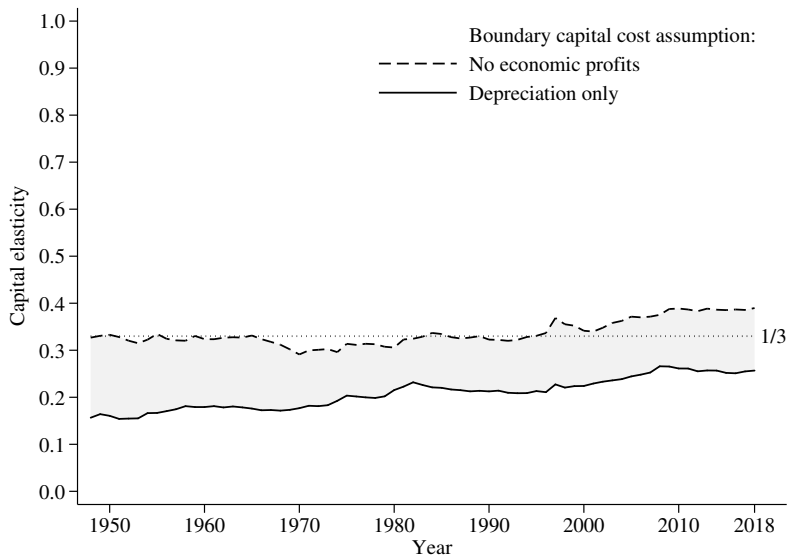
# Summary

This paper answers those questions:

- Calculate elasticities for US 1948-2018, OECD 1995-2015
- Applies the methodology of Baqaee and Farhi (2017, 2018)
- Industry-specific cost structure, market power, and input-output relationships
- Creates bounds for those elasticities given issues with measuring capital costs

# Preview of U.S. results

Robert Solow was kind-of, sort-of right?



# Relevance and contribution

The answer informs us on:

- Consequences of aggregate shocks
- Convergence speed, transition dynamics
- Distribution of GDP to labor, capital, profits
- Validity of decades of macro papers calibrated using  $\alpha = 1/3$

# Relevance and contribution

Literature on labor's share of GDP: Gollin (2002); Young and Zuleta (2013a,b); Elsby, Hobijn, and Sahin (2013); Karabarbounis and Neiman (2014); Gomme and Rupert (2014); Rognlie (2015); Barkai (2017); Smith, Yagan, Zidar, Zwick (2017); Karabarbounis and Neiman (2018); Koh, Santaella-Llópis, Zheng (2018)

Differences and similarities:

- Elasticities don't equal shares if markups  $> 1$
- Elasticities could provide part of explanation for labor share decline
- Elasticity calculation explicitly at industry level vs. aggregate
- Same data and imputation problems

# Theoretical setting

## Borrowed completely from Baqaee and Farhi (2017, 2018)

Each industry  $i$  has constant-returns cost function. Industry  $i$  has costs as follows:

$$COST_i = COST_{iM} + COST_{iK} + COST_{iL} \quad (1)$$

The first term is total intermediate costs from  $J$  total industries:

$$COST_{iM} = \sum_{j=1}^J COST_{ij} \quad (2)$$

# Theoretical setting

Cost shares for intermediates defined as

$$\lambda_{ij} = \frac{COST_{ij}}{COST_i} \quad (3)$$

and for factors of production as

$$\lambda_{iK} = \frac{COST_{iK}}{COST_i} \quad (4)$$

$$\lambda_{iL} = \frac{COST_{iL}}{COST_i}. \quad (5)$$



# Theoretical setting

Build the matrix of cost shares

$$\Lambda = \begin{bmatrix} \lambda_{11} & \lambda_{12} & \cdots & \lambda_{1J} & \lambda_{1K} & \lambda_{1L} \\ \lambda_{21} & \lambda_{22} & \cdots & \lambda_{2J} & \lambda_{2K} & \lambda_{2L} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \vdots \\ \lambda_{J1} & \lambda_{J2} & \cdots & \lambda_{JJ} & \lambda_{JK} & \lambda_{JL} \\ 0 & 0 & \cdots & 0 & 0 & 0 \\ 0 & 0 & \cdots & 0 & 0 & 0 \end{bmatrix} \quad (6)$$

where labor and capital are treated as “industries” that provide an input to other industries.

# Theoretical setting

Value-added shares of GDP,  $VA = \sum_{j=1}^J va_j$ ,

$$\gamma_j = \frac{va_j}{VA}. \quad (7)$$

Collect in a vector,

$$\Gamma' = [\gamma_1 \quad \gamma_2 \quad \cdots \quad \gamma_J \quad 0 \quad 0] \quad (8)$$

# Theoretical setting

Calculate “cost-based” Domar weights - value-added weights times the Leontief inverse.

$$E = \Gamma'(I - \Lambda)^{-1} \quad (9)$$

The structure of  $E$  is as follows,

$$E = \begin{bmatrix} \epsilon_1 & \epsilon_2 & \cdots & \epsilon_J & \epsilon_K & \epsilon_L \end{bmatrix} \quad (10)$$

# Theoretical setting

Baqaei and Farhi prove that the entries  $\epsilon_K$  and  $\epsilon_L$  are the elasticity of aggregate output (GDP) with respect to the aggregate stock of  $K$  and  $L$ .

- Domar weights capture elasticity of GDP w.r.t. productivity in industry  $i$ , capturing downstream and upstream effects
- For labor and capital “industries”, productivity increase is expansion of their supply.
- Only downstream effects of labor and capital, as they purchase no inputs.
- “Cost-based” Domar weights deals with arbitrary markups of prices over costs in industries.

# Theoretical setting

This nests your favorite methods for estimating  $\epsilon_K$  and  $\epsilon_L$ .

Solow (1957)

- No I/O structure:  $\lambda_{ij} = 0$  for any two industries
- Zero profits:  $\lambda_{iK} = RK_i/VA_i$  and  $\lambda_{iL} = wL_i/VA_i$
- Result is that  $\epsilon_K = RK/VA$  and  $\epsilon_L = wL/VA$

# Theoretical setting

Hall (1988, 1990)

- No I/O structure:  $\lambda_{ij} = 0$  for any two industries
- Non-zero profits:  $\lambda_{iK} = RK_i / (RK_i + wL_i)$  and  $\lambda_{iL} = wL_i / (RK_i + wL_i)$
- Result is that  $\epsilon_K = RK / (RK + wL)$  and  $\epsilon_L = wL / (RK + wL)$
- Aside on markup ( $\mu$ ) and shares of GDP (similar for labor):

$$\epsilon_K = \frac{Y}{RK + wL} \frac{RK}{Y} = \mu \frac{RK}{Y} \quad (11)$$

Hulten (1978)

- I/O structure:  $\lambda_{ij} \neq 0$  for any two industries
- Zero profits:  $\lambda_{iK} = RK_i/VA_i$  and  $\lambda_{iL} = wL_i/VA_i$
- Result is that  $\epsilon_K = RK/VA$  and  $\epsilon_L = wL/VA$
- Envelope result. No distortions so I/O structure is irrelevant

# Implementation

Big issues in plugging data into the Baqaee and Farhi structure given national accounts. Simplifying

$$GDP = COMP + TAX + PROP + ROS \quad (12)$$

Cannot cleanly extract labor or capital costs for any industry

- 1 Proprietors income ( $PROP$ ) contains labor costs, capital costs, economic profits
- 2 Residual operating surplus ( $ROS$ ) contains capital costs and economic profits

Problem measuring costs ....



# Implementation

....and the industry definitions are not consistent over time.

Series	I/O table	National accounts	Capital Stock
1947-62	NAICS 2012 (47 ind)	SIC 1972	BEA/NAICS 2012
1963-86	NAICS 2012 (65 ind)	SIC 1972	BEA/NAICS 2012
1987-96	NAICS 2012 (65 ind)	SIC 1987	BEA/NAICS 2012
1997-18	NAICS 2012 (71 ind)	NAICS 2012	BEA/NAICS 2012

All data is from the BEA. Used BEA crosswalks and own assumptions to map all data into NAICS 2012 coding that matched the I/O tables.

# Implementation

Absence of precise cost information for capital and labor. Strategy:

- I/O table reports actual costs of intermediates, no problem
- Allocate proprietors income to calculate labor costs
- Construct different series of  $\epsilon_K$  and  $\epsilon_L$  based on capital cost assumptions
- Try to *bound* the elasticities based on theory/data
- Undertake variations on assumptions, do they stay in bounds?

**Labor costs:** Allocate a portion of proprietors income to labor. General principle:

$$COST_{iLt} = COMP_{it} + PROP_{it} \left( \frac{COMP_{it}}{VA_{it} - PROP_{it}} \right). \quad (13)$$

This follows Gomme and Rupert (2004).

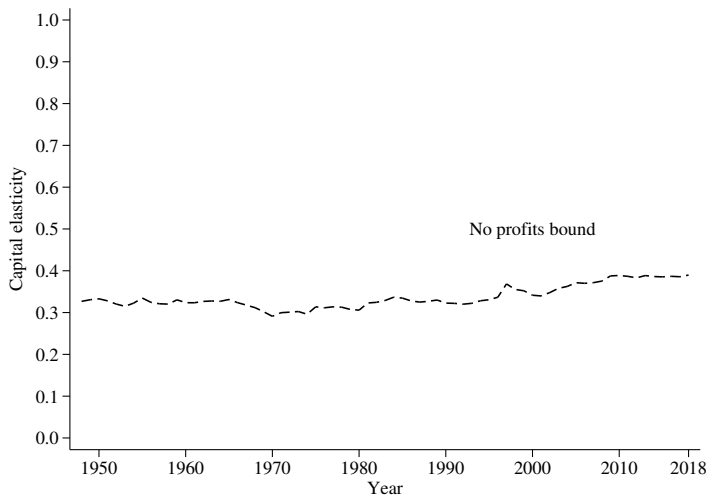
# Implementation

**Capital costs:** Set the *upper bound* for capital costs by assuming there are zero profits.

$$COST_{iKt}^{NoProf} = VA_i - COST_{iLt}. \quad (14)$$

Gives an *upper bound* for  $\epsilon_K$ . Note this will be the *lower bound* for  $\epsilon_L$ .

# Implementation



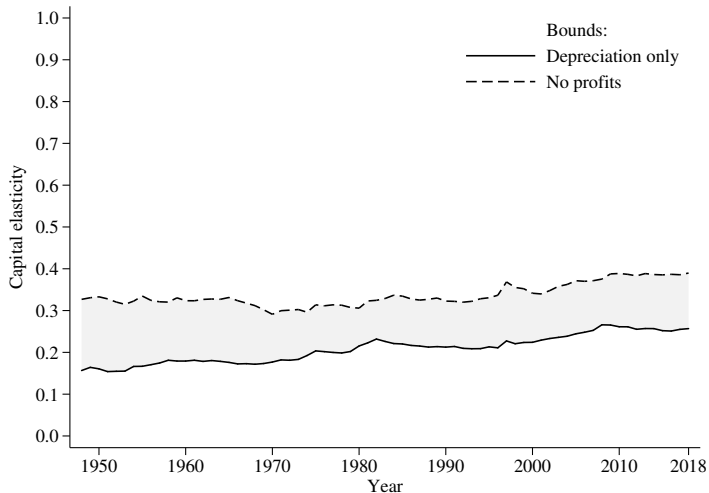
# Implementation

**Capital costs:** Set the *lower bound* for capital costs by using the cost of depreciation ( $DEPR_{it}$ ), which is reported by industry. Assumes zero financing costs of existing capital stock.

$$COST_{iKt}^{Depr} = DEPR_{it}. \quad (15)$$

Gives an *lower bound* for  $\epsilon_K$ . Note this will be the *upper bound* for  $\epsilon_L$ .

# Implementation



# Implementation

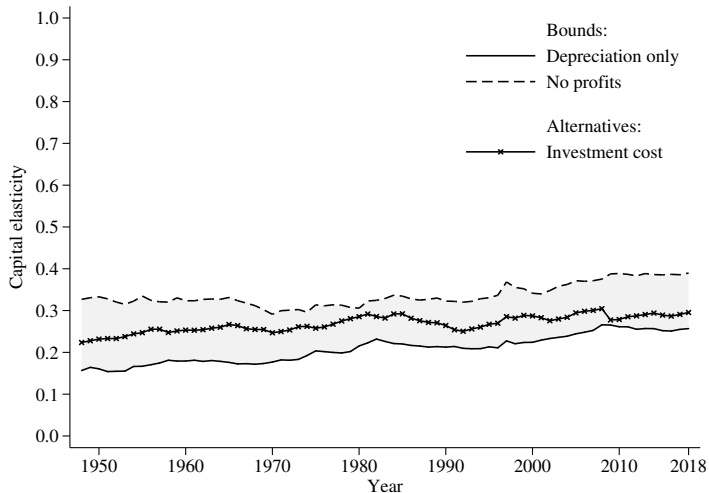
**Capital costs:** Total investment ( $INV_{it}$ ) is reported by industry. Combines replacement of depreciation and purchase of new capital goods. In Golden rule world  $INV = RK$ .

$$COST_{iKt}^{Inv} = INV_{it}. \quad (16)$$

Calculate  $\epsilon_K$  and  $\epsilon_L$ .



# Implementation



# Implementation

**Capital costs:** Calculate the user cost of capital by industry. Three types of capital (structure, equipment, IP).

$$COST_{iKt}^{User} = \sum_{j \in st, eq, ip} K_{ijt} R_{ijt}. \quad (17)$$

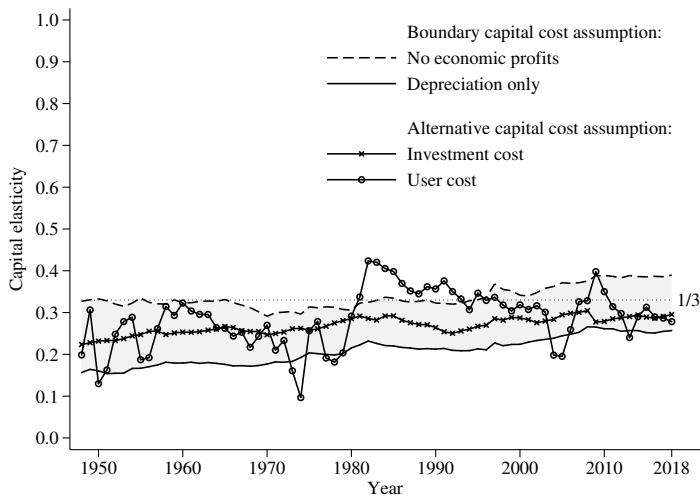
where

$$R_{ijt} = (Int_{it} - E[\pi_{ijt}] + \delta_{ijt}) \frac{1 - z_{jt}\tau_t}{1 - \tau_t} \quad (18)$$

is the rental rate of each type.

- $Int_{it}$ : nominal interest rate facing industry  $i$
- $E[\pi_{ijt}]$ : expected inflation of capital type  $j$  for industry  $i$
- $\delta_{ijt}$ : depreciation of capital type  $j$  for industry  $i$  (BEA)
- $z_{jt}$ : depreciation allowance for capital type  $j$  in tax code (BEA)
- $\tau_t$ : effective corporate tax rate (BEA)

# Implementation

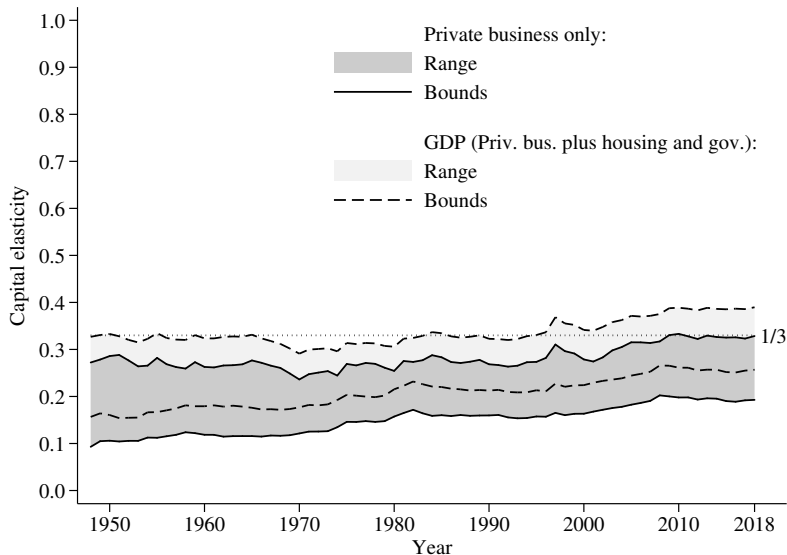


Private sector business only:

- Exclude government (cost shares not far from average)
- Exclude housing (relatively high capital and low labor cost)

Lower implied capital elasticity (and higher labor elasticity)

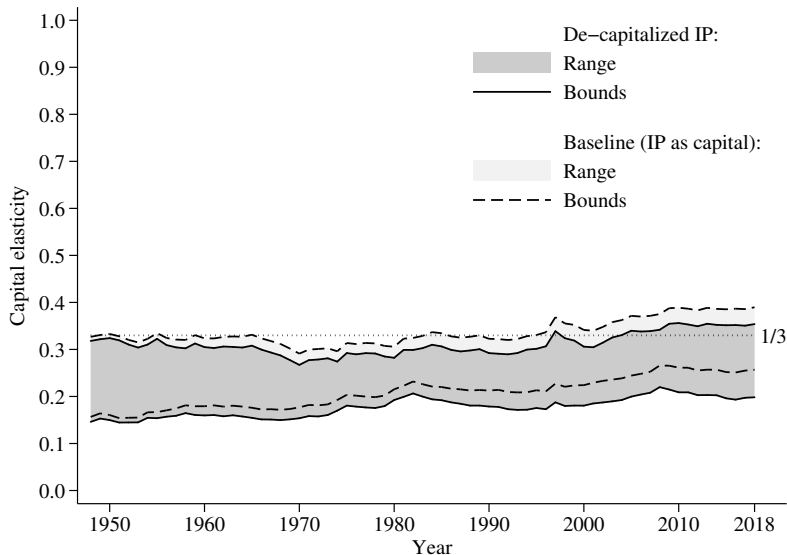
# Variations



## Intellectual property?

- Elasticity rises over time
- But may be because data on IP from pre-1990 is scarce?
- Koh, Santaaulalia-Llopis, Zheng (2018): aggregate labor share falls due to IP accounting

# Variations



# Aggregate cost shares

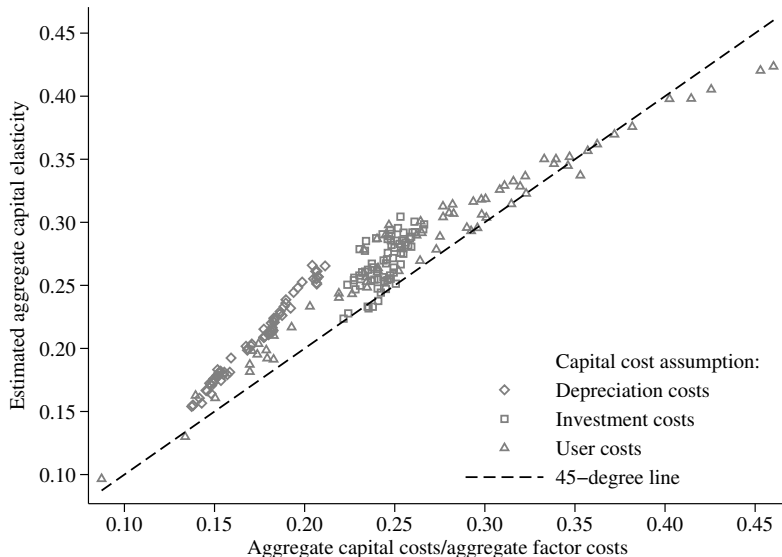
Define the following aggregate cost share for capital:

$$s_{Kt}^{Cost} = \frac{\sum_{j \in J} COST_{jKt}}{\sum_{j \in J} COST_{jKt} + COST_{jLt}}. \quad (19)$$

If there were no I/O relationships, then  $\epsilon_{Kt} \rightarrow s_{Kt}^{Cost}$ .



# Aggregate cost shares



# Decomposition

From the calculation of  $E$ ,

$$\epsilon_{Kt} = \sum_{i \in J} va_{it} \ell_{iKt} \quad (20)$$

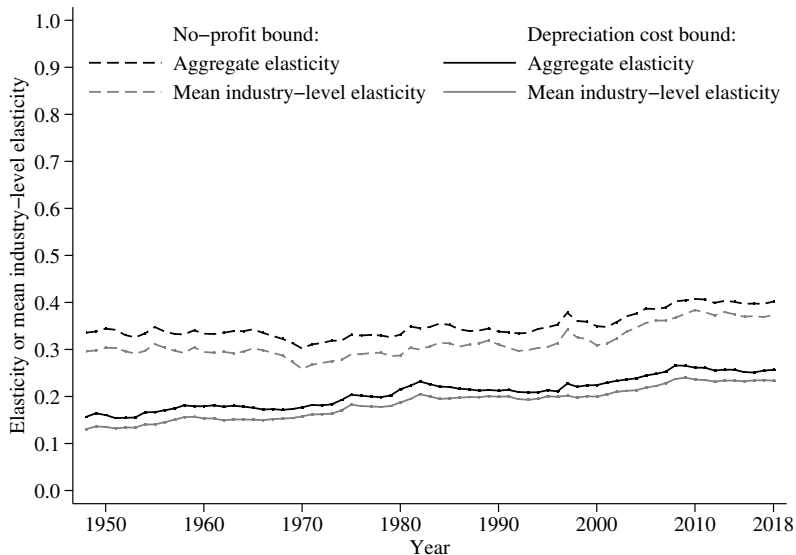
where  $va_{it}$  are value-added shares and  $\ell_{iKt}$  are Leontief inverse entries.

Do an Olley-Pakes type decomposition of  $\epsilon_{Kt}$

$$\epsilon_{Kt} = \bar{\ell}_{Kt} + \sum_{i \in J} (va_{it} - \bar{va}_t)(\ell_{iKt} - \bar{\ell}_{Kt}), \quad (21)$$

where  $\bar{\ell}_{Kt}$  is mean industry elasticity, and summation is covariance of industry elasticity and size of industry.

# Decomposition



**OECD:** Create similar bounds for OECD countries using data 2005-2015.

- STAN database for I/O accounts and national accounts data by industry
- STAN does not separate out proprietors income
- 2005-2015: ISIC v.4
- Less re-mapping necessary between I/O and national accounts

**Labor costs:** Without proprietors income

$$COST_{iLt} = COMP_{it} + SELF_{it} \frac{COMP_{it}}{EMPL_{it}}. \quad (22)$$

- $SELF_{it}$  are self-employed and  $EMPL_{it}$  are formal employees.
- Probably understates labor costs as proprietors tend to be high wage.

# Comparison

**Capital costs:** Do similar bounding exercise

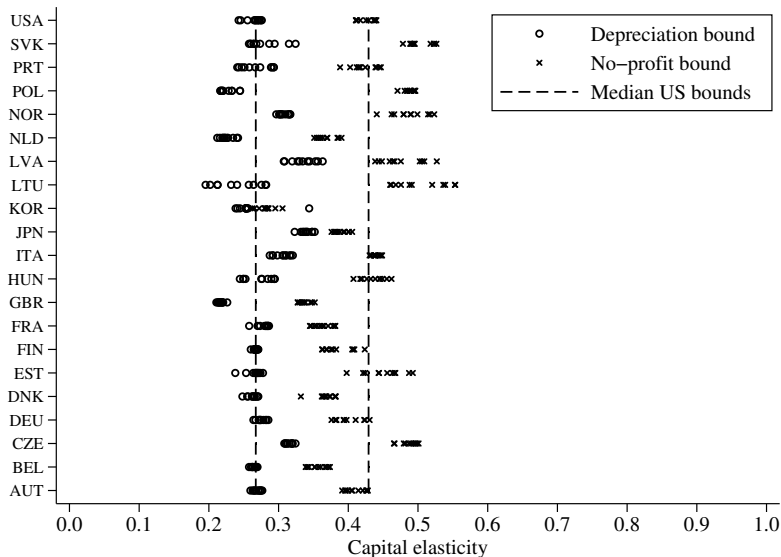
Upper bound on capital elasticity using

$$COST_{iKt}^{NoProf} = VA_i - COST_{iLt}. \quad (23)$$

Lower bound on capital elasticity using

$$COST_{iKt}^{Depr} = DEPR_{it}. \quad (24)$$

# Comparison



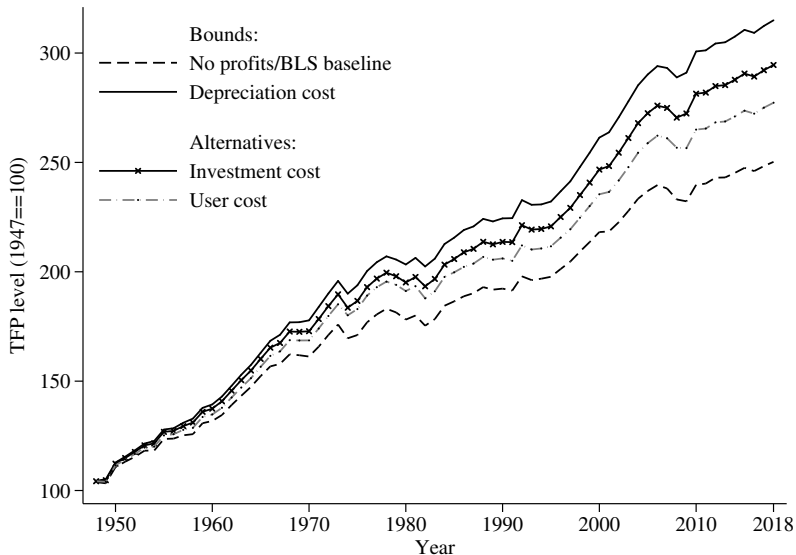
For a typical growth accounting exercise:

$$d \ln TFP_t = d \ln Y_t - \epsilon_{Kt} d \ln K_t - \epsilon_{Lt} d \ln L_t. \quad (25)$$

- The implied growth in TFP depends on the elasticities
- BLS uses the “no-profit” assumption only
- Effect is ambiguous



# Growth Accounting



# Conclusions

- Naive capital elasticity ( $1/3$ ) is an upper bound for most of period
- ...but this bound shifted up over time
- Scope of economic activity matters: housing pulls up capital elasticity
- Structural change did not appear to drive shifts, within-industry changes
- Consistent across the OECD for short time frame

Remaining work, caveats, and questions...

- What are second-order effects for large changes in  $K$  or  $L$ ?
- Are cost structures consistent with industry-level estimates?
- Can infer markups from elasticities and shares. Consistent with firm-level evidence?
- Expand OECD coverage over time