

# Accounting for Factorless Income

Loukas Karabarbounis  
University of Minnesota

Brent Neiman  
University of Chicago

May 2018

# Introduction

- Value added produced in an economy equals sum of:
  - Compensation to labor
  - Capital rental payments
  - Economic profits

# Introduction

- Value added produced in an economy equals sum of:
  - Compensation to labor
  - Capital rental payments
  - Economic profits
  
- Or,  $s_L + s_K + s_\pi = 1$

# Introduction

- Value added produced in an economy equals sum of:
  - Compensation to labor
  - Capital rental payments
  - Economic profits
  
- Or,  $s_L + s_K + s_\pi = 1$
  
- Separating these matters for understanding:
  - Production technology
  - Competition in product markets
  - Factor shares and inequality
  - Responsiveness to policies (monetary, tax, regulatory)

# Introduction

- But, it's hard to measure these components!

# Introduction

- But, it's hard to measure these components!
- Economic profits?

# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs

# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs
- Capital rental payments?



# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs
- Capital rental payments? Firms own their capital

# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs
- Capital rental payments? Firms own their capital
- Wages and benefits?

# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs
- Capital rental payments? Firms own their capital
- Wages and benefits? Proprietors, mixed income, etc.

# Introduction

- But, it's hard to measure these components!
- Economic profits? Bad data on costs
- Capital rental payments? Firms own their capital
- Wages and benefits? Proprietors, mixed income, etc.
- Relative ease in measuring labor compensation drove focus on labor share  $s_L$ , which was historically constant

# Introduction

- $s_L$  has declined globally in recent decades, and most imputations of  $s_K$  don't offset it during this period
- Hence, significant residual has risen since 1980
- We call this residual “factorless income”, defined as:

$$\text{Factorless Income} = Y - WL - RK,$$

where:

- $Y$  is value added from national accounts
- $WL$  is compensation from national accounts
- $K$  is capital from the national accounts
- $R$  is calculated rental rate, following Hall-Jorgenson (1967)

# How to Allocate/Interpet Factorless Income?

- Three (among other) Possibilities:
  - ① Maybe it's all profits (*Case  $\Pi$* )
  - ② Maybe we are “missing” investment (*Case  $K$* )
  - ③ Maybe our imputation of rental rate isn't good (*Case  $R$* )

# How to Allocate/Interpret Factorless Income?

- Three (among other) Possibilities:
  - ① Maybe it's all profits (*Case  $\Pi$* )
  - ② Maybe we are “missing” investment (*Case  $K$* )
  - ③ Maybe our imputation of rental rate isn't good (*Case  $R$* )
- Variants of these three strategies are common in literature:
  - ① *Case  $\Pi$*  : Hall (1990), Rotemberg and Woodford (1995), Basu and Fernald (1997), Rognlie (2016), Barkai (2017), + others
  - ② *Case  $K$*  : Hall (2001), McGrattan and Prescott (2005), Corrado, Hulten, and Sichel (2009), + others
  - ③ *Case  $R$*  : KLEMS, Gomme, Ravikumar, and Rupert (2011), Koh, Santaella-Llopis, and Zheng (2016), + others

# What We Do

- Explore these three interpretations of US factorless income and elaborate on their implications for tech, inequality, etc.
- We are skeptical of *Case Π*
  - $s_{\Pi}$  rises since '80, but still below historical levels
  - Requires extremely volatile path of technology
- We are more open, but still skeptical of *Case K*
  - Recent scale of unmeasured capital plausible, less so in the 60s
  - Requires potentially different take on GDP (and labor share)
- We find *Case R* most promising, but requires better explanation for why  $r$  deviates from Treasuries



# Agenda

- **Notation and Data**
- (Almost) Model-free Analysis
  - *Case  $\Pi$*  , with discussion of De Loecker and Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - TFP Comparison
- Model, Calibration, and Counterfactuals

# Notation

- Business sector (i.e. corporate and non-corporate)
  - Value added:  $P^Q Q$
  - Labor Compensation:  $WL$
- Housing (i.e. residential sector)
  - Value added:  $P^H H$
  - Labor Compensation: 0
- Private Economy
  - GDP (ex gov't):  $Y = P^Q Q + P^H H$
  - Profits:  $\Pi = \Pi^Q + \Pi^H$

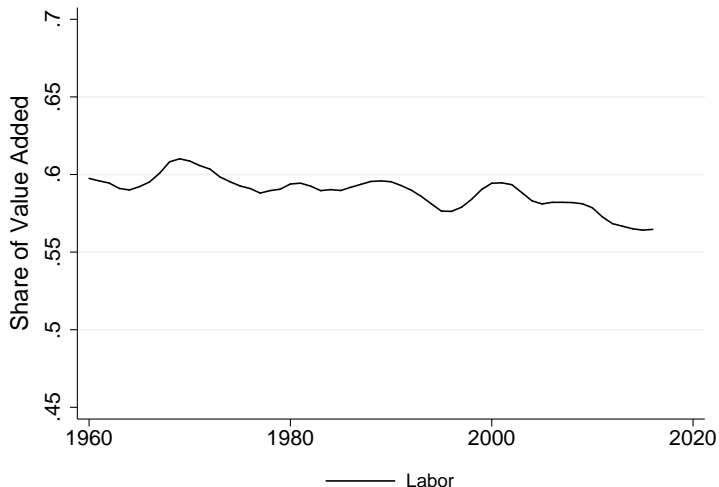
# Data

- Data from US NIPA and FAT, exclude government, 1960-2016
- $RK = \sum_j R^j K^j$ , where we have three capital types:
  - $j = I$ : IT capital (used by business sector). Includes information processing equipment and software.
  - $j = N$ : Non-IT capital (used by business sector). Includes non-residential structures, industrial, transportation, and other equipment, R&D, and entertainment and artistic originals.
  - $j = H$ : Housing (consumed by households)
- Rental rate (derived from model below, taxes removed here):

$$R_t^j = \xi_t^j \left[ \left( \frac{\xi_{t-1}^j}{\xi_t^j} \right) (1 + r_t) - (1 - \delta_t^j) \right]$$

## Data

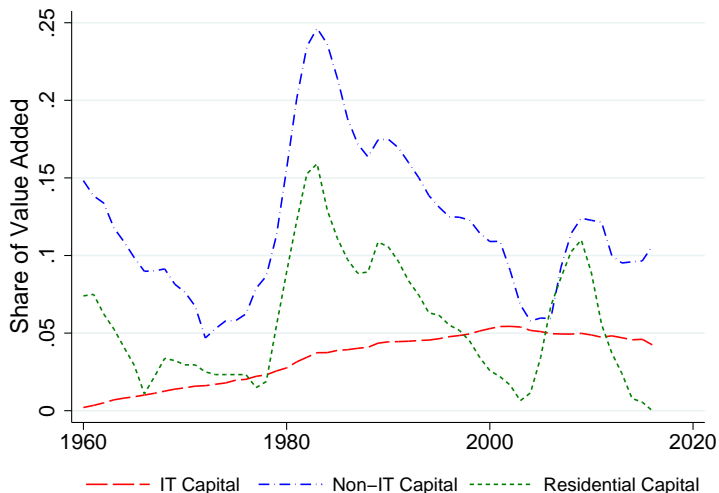
- How do factor shares look before allocating factorless income?



(Note: All plots throughout are 5-year moving averages.)

# Data

- How do factor shares look before allocating factorless income?

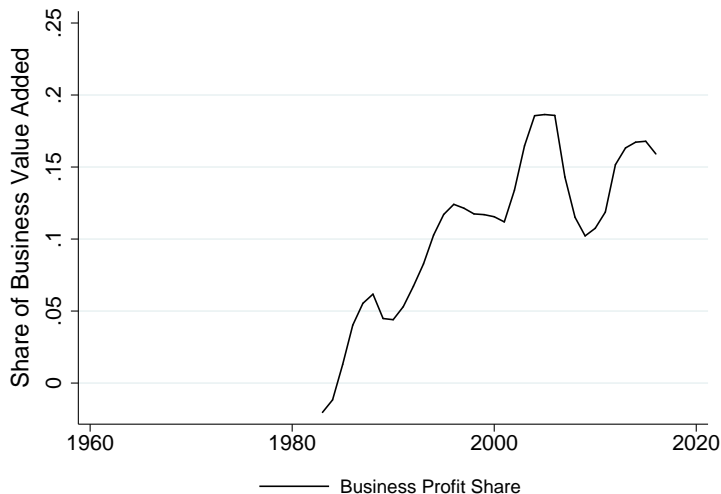


# Agenda

- Notation and Data
- (Almost) Model-free Analysis
  - **Case  $\Pi$** , and discussion of De Loecker & Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - TFP Comparison
- Model, Calibration, and Counterfactuals

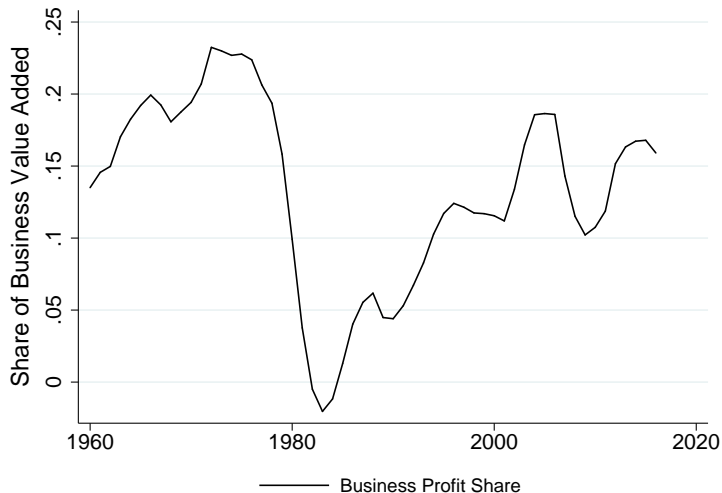
## Case Π

- $s_{\Pi} \uparrow$  since 1980 led to  $s_L \downarrow$  (Barkai '17; Eggertsson et al. '18)
- Referenced by view that monopoly power  $\uparrow$  or call for antitrust
- Seemingly consistent with DeLoecker-Eeckhout (DLE, 2017)



## Case $\Pi$

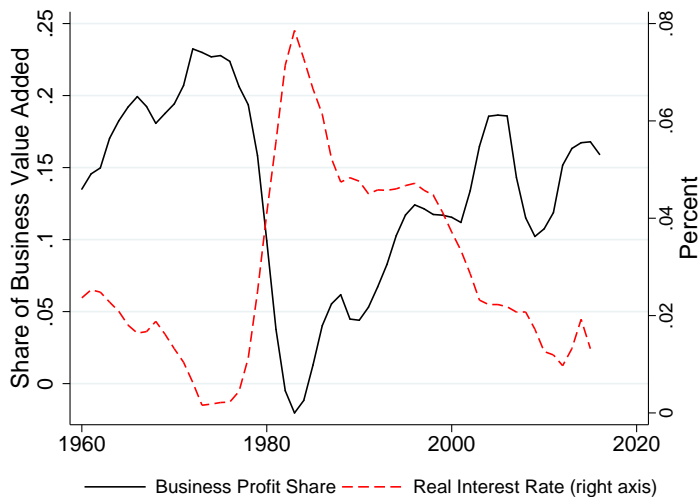
- But  $s_{\Pi}$  remains below average levels from 1960s/1970s





## Case $\Pi$

- $\text{Correl}(r, s_{\Pi}) = -0.91$ : Little information beyond behavior of  $r$



## Case Π

- Additional Implication: Not a markup shock on its own!
  - Stories must tightly link declining  $r$  and rising  $s_{\Pi}$
  - Labor's share of business costs was 0.85 in 60s/70s, dropped to 0.70 in 1980 then rose back to 0.80 after 2000
  - Will formalize later, but major implications for technology

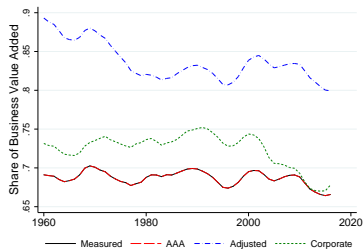
## Case $\Pi$

- Housing is a useful illustration, motivated by Vollrath (2017)
- Results look qualitatively the same as business sector!

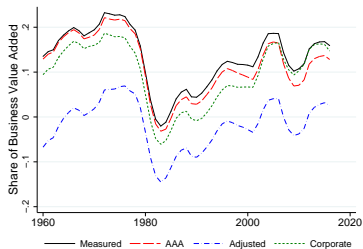


# Case $\Pi$ – Robustness

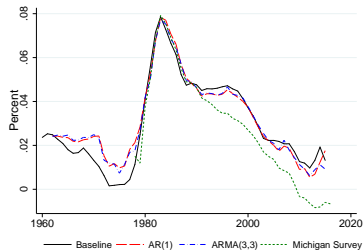
## Alternative Labor Shares



## Implied Profit Shares



## Alternative Inflation Expectations

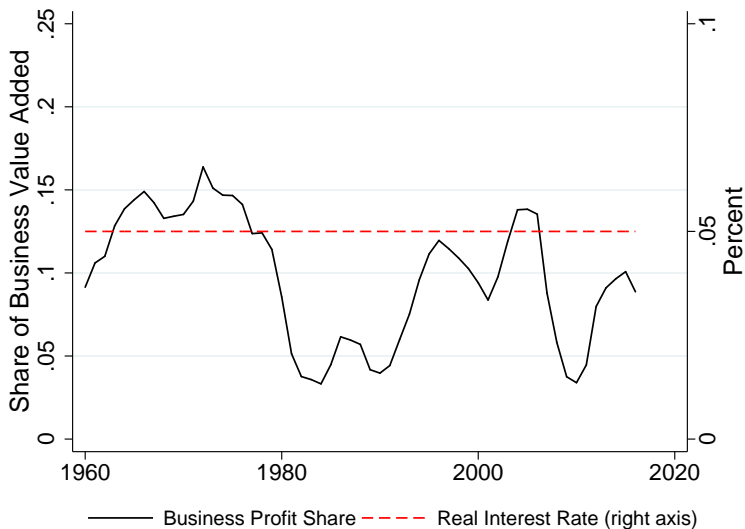


## Implied Profit Shares



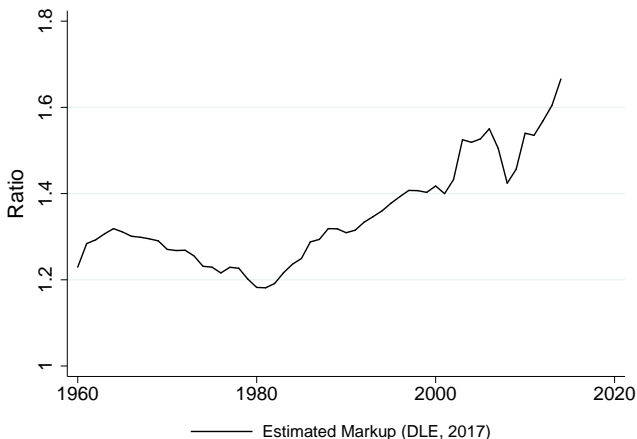
## Case $\square$

- What about with (hypothetical) flat real interest rate?



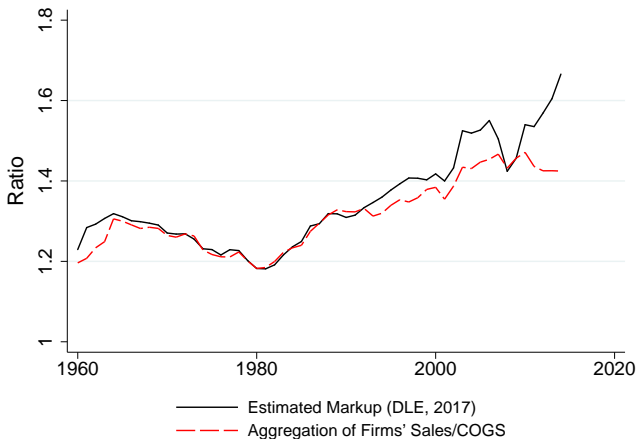
# What About De Loecker and Eeckhout (2017)?

- **Case  $\Pi$**  not only evidence of rising profit share and markups
- DLE (2017) shows surge since 1980 using Compustat Data



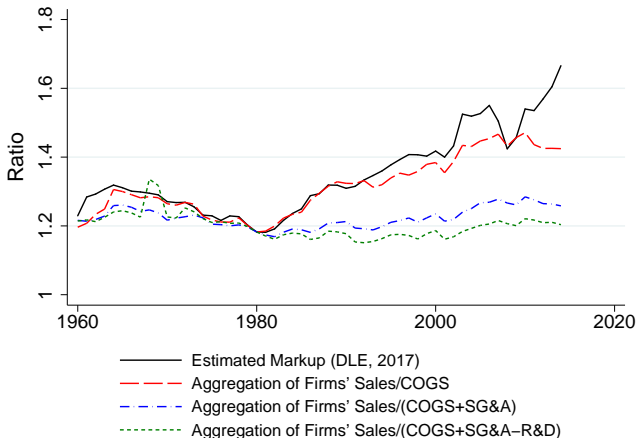
# What About De Loecker and Eeckhout (2017)?

- DLE (2017) shows surge since 1980 using Compustat Data
- “Driver” of this surge is Sales/COGS



# What About De Loecker and Eeckhout (2017)?

- But rise in Sales/COGS due to fall in  $\text{COGS}/(\text{COGS}+\text{SG\&A})$ !
  - First showed by Traina (2018)
  - Consistent with Gutierrez and Philippon (2017)



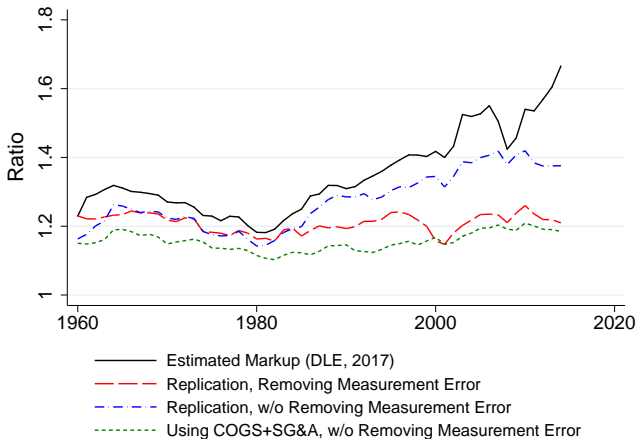


## What About De Loecker and Eeckhout (2017)?

- COGS: “...all expenses directly allocated by the company to production, such as material labor, and overhead...”
- SG&A: “...all commercial expenses of operation (such as, expenses not directly related to product production) incurred in the regular course of business pertaining to the securing of operating income...”
- Compustat only includes items in COGS if company does not itself allocate to SG&A.
- Compustat only includes items in SG&A if company does not itself allocate to COGS.
- Even if SG&A has more fixed costs than COGS, this **means that markups are less related to profits**, labor share, etc.

# What About De Loecker and Eeckhout (2017)?

- Actual Markup Estimates? Our best efforts...



# What About De Loecker and Eeckhout (2017)?

Country	Trend (per 10 years)		Years Covered		Firms Included	
	$\frac{\text{Sales}}{\text{COGS}}$	$\frac{\text{Sales}}{\text{COGS}+\text{SG\&A}}$	Start	End	Min	Max
Brazil	-0.04	-0.00	1996	2016	128	284
China	-0.01	-0.02***	1993	2016	314	3683
France	-0.07*	-0.01	1999	2016	111	631
Germany	0.00	0.03***	1998	2016	119	668
India	0.12***	0.06**	1995	2016	630	2890
Italy	0.00	-0.06***	2005	2016	202	264
Japan	0.06***	0.03***	1987	2016	2128	3894
Korea	0.00	-0.03***	1987	2016	419	1682
Russia	-0.13	-0.01	2004	2016	127	245
Spain	0.27**	-0.03	2005	2016	102	128
Taiwan	-0.05**	-0.02	1997	2016	160	1789
United Kingdom	0.28***	0.07***	1988	2016	183	1489
United States	0.09***	0.02***	1981	2016	3136	8403
<b>Simple Average</b>	<b>0.04</b>	<b>0.00</b>				

## Case $\Pi$ Summary

- We do not think all factorless income is economic profits
- Highlights mechanical role of  $r$  and, therefore, huge decline in profits from the 60s/70s to 80s and reversion from 80s to now
- Major fluctuations in labor's share of costs will require huge fluctuations (in both directions!) of factor-biased technology
- Other evidence extremely sensitive and, if picking up rising fixed costs, potentially informative about  $\mu$  but not about  $\Pi$

# Agenda

- Notation and Data
- (Almost) Model-free Analysis
  - *Case  $\Pi$*  , with discussion of De Loecker and Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - TFP Comparison
- Model, Calibration, and Counterfactuals

## Case $K$

- Idea is we “miss” certain investment expenditures
- Let  $\xi^U$  denote the price of unmeasured investment
- Let  $X^U$  denote the quantity of unmeasured investment
- Let  $R^U$  denote the rental rate of unmeasured capital
- Let  $K^U$  denote the stock of unmeasured capital

## Case K

- “Revised” GDP  $\tilde{Y}$  related to measured income  $Y$  as:

$$\tilde{Y} = Y + \xi^U X^U = WL + R^I K^I + R^N K^N + R^H K^H + \Pi + R^U K^U$$

- We rearrange so RHS is all known or assumed:

$$R^U K^U - \xi^U X^U = Y - WL - R^I K^I - R^N K^N - R^H K^H - \Pi^Q - \Pi^H$$

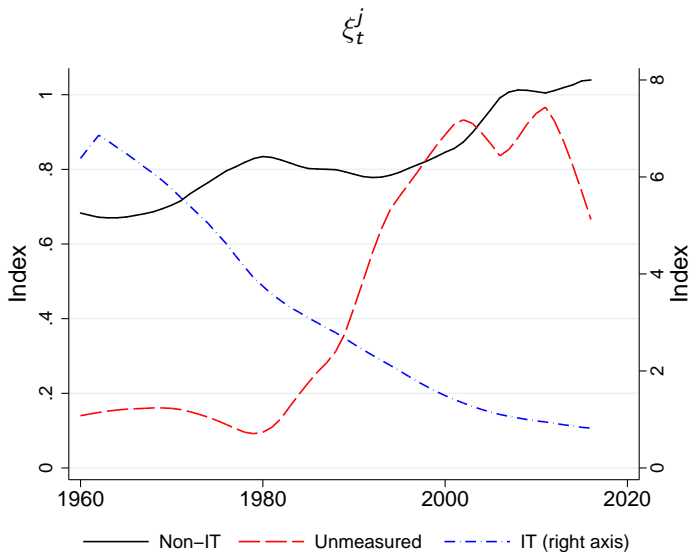
- We can solve for  $\{\xi_t^U, X_t^U, R_t^U, K_t^U\}$  which satisfies:
  - Above equation
  - $R_{t+1}^U = R(\xi_t^U, \xi_{t+1}^U, \delta^U, r_t)$
  - $K_{t+1}^U = (1 - \delta_t^U) K_t^U + X_t^U$

## Case K

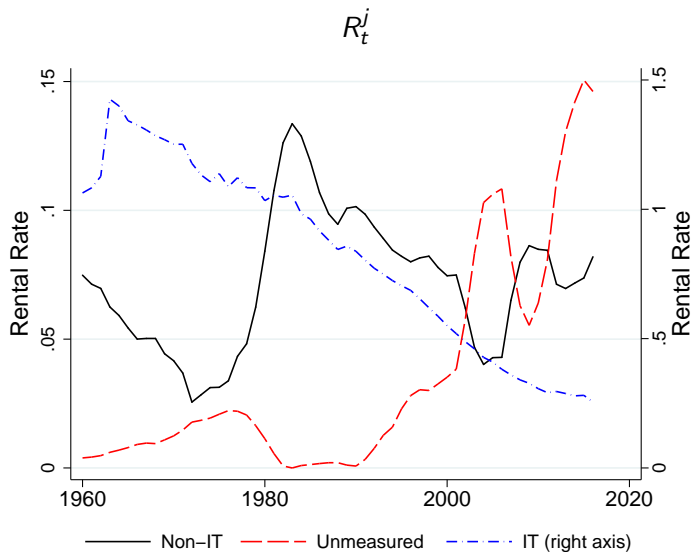
- Leave  $\Pi_t^H$  as in **Case Π**, choose  $\Pi^Q = 0.06$ , and  $\delta^U = 0.05$
- Many different paths of  $\{\xi_t^U, X_t^U, R_t^U, K_t^U\}_{(t \in 1960, 2016)}$
- We choose one such path, with small  $\xi_t^U X_t^U$  and  $\text{Vol}\left(\frac{\xi_{t+1}^U}{\xi_t^U}\right)$
- (We could do strictly better with variation in  $s_{\Pi}^Q$  or  $\delta^U$ )



# Case K

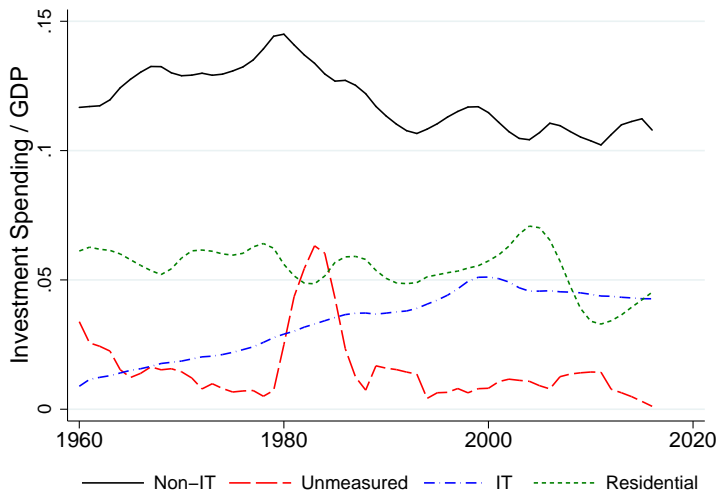


# Case K



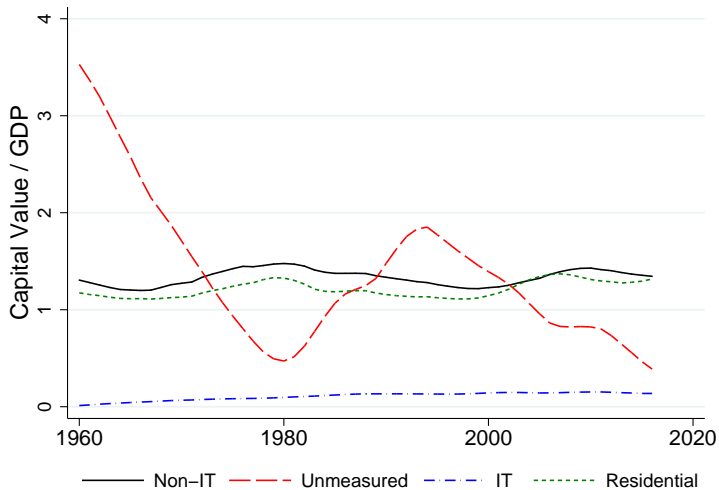
# Case K

$$\xi_t^j X_t^j / \tilde{Y}_t$$



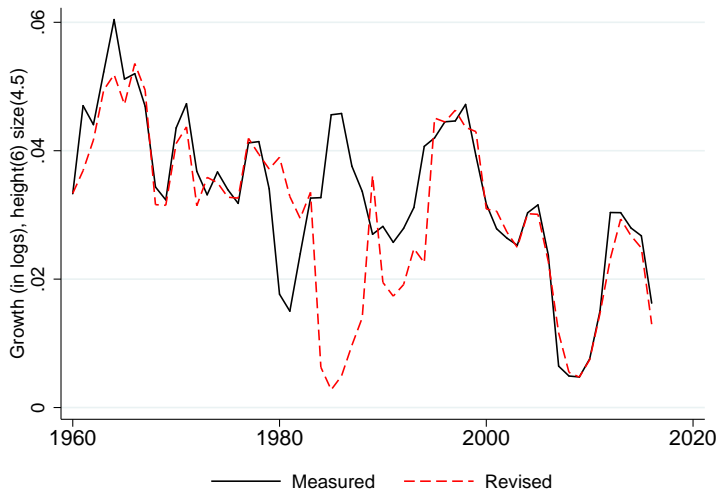
# Case K

$$\xi_t^j K_t^j / \tilde{Y}_t$$



# Case K

$$\ln \left( \tilde{Y}_{t+1} / \tilde{Y}_t \right) \text{ and } \ln \left( Y_{t+1} / Y_t \right)$$



## Case K Summary

- One case of factorless income arising from unmeasured capital
- Recent scale similar to Hall (2001) or Eifeldt & Papanikolaou (2013), though scale before 1970 implausibly large.
- Scale nowhere near Corrado, Hulten, and Sichel (2009) – must envision unmeasured capital more broadly than “IT”
- Note that tradeoff between scale early vs. late reflects decision to minimize  $\xi^U X^U$
- Requires re-evaluation of factor share dynamics since “revised” GDP differs in some years

# Agenda

- Notation and Data
- (Almost) Model-free Analysis
  - *Case  $\Pi$*  , with discussion of De Loecker and Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - TFP Comparison
- Model, Calibration, and Counterfactuals

## Case R

- Idea is lots of factors omitted from our rental-rate calculation (risk premium, adjustment costs, etc.)
- Solve for revised opportunity cost of capital  $\tilde{r}$  such that:

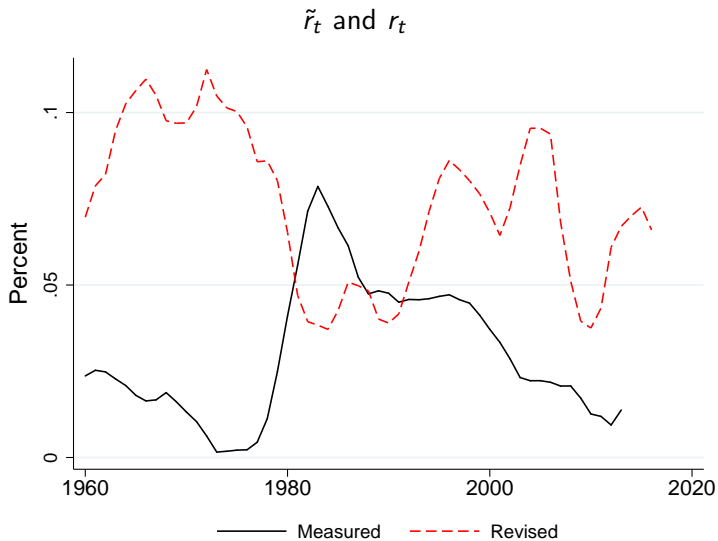
$$P^Q Q - WN - \tilde{R}^I K^I - \tilde{R}^N K^N - \Pi^Q = 0,$$

where  $\tilde{R}^j = R(\tilde{r}, \cdot)$  and where  $\Pi^Q = 0.06$  as in **Case K**.

- Assumption made in KLEMS, Gomme, Ravikumar, and Rupert (2011), and Koh, Santaelalia-Llopi, and Zheng (2016)

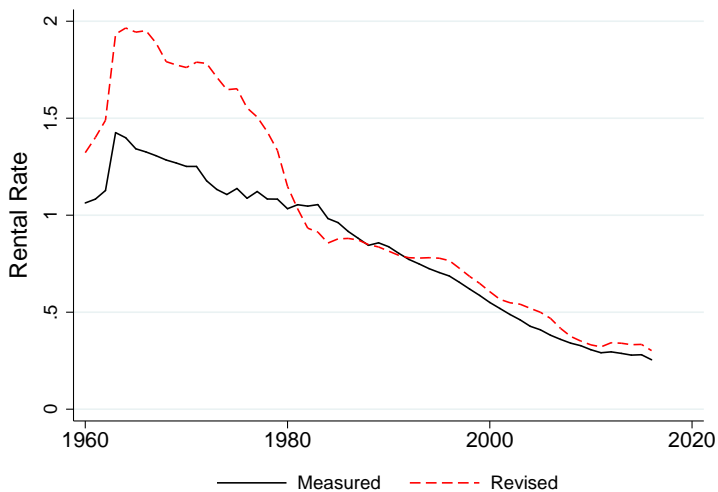


# Case R



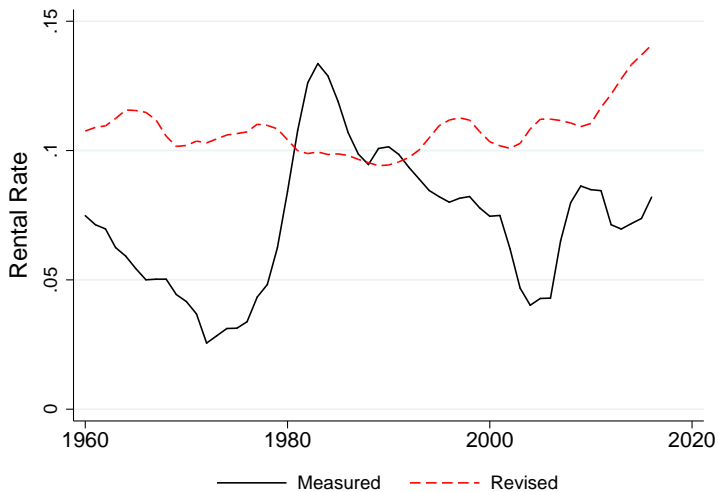
# Case R

$\tilde{R}_t^I$  and  $R_t^I$



# Case R

$\tilde{R}_t^N$  and  $R_t^N$



# Case R

$\tilde{R}_t^H$  and  $R_t^H$



## Case $R$ Summary

- Shifting  $r$  to account for factorless income results in more stable paths for interest and rental rates
- Similar logic drives conclusion in Caballero, Farhi, and Gourinchas (2017) that risk premium has risen since 1980
- We find this most promising of our cases, though it clearly requires elaboration on where gap between  $\tilde{r}$  and  $r$  comes from

# Agenda

- Notation and Data
- (Almost) Model-free Analysis
  - *Case  $\Pi$*  , with discussion of De Loecker and Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - **TFP Comparison**
- Model, Calibration, and Counterfactuals

## Naive vs. Modified TFP

- Standard “Naive” Solow Residual uses factor shares of revenues:

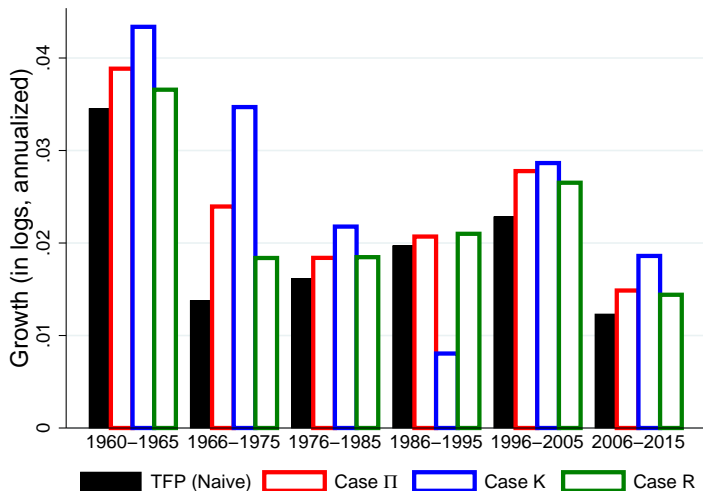
$$d \ln \text{TFP}_{\text{Naive}} = d \ln Q - s_L^Q \times d \ln L - \left(1 - s_L^Q\right) \sum_{j \in \{I, N\}} \frac{s_{Kj}^Q}{s_K^Q} \times d \ln K^j$$

- “Modified” Solow Residual uses factor shares of costs and better approximates technology:

$$d \ln \text{TFP}_{\text{Modified}} = d \ln Q - \frac{s_L^Q}{1 - s_{\Pi}^Q} \times d \ln L - \sum_{j \in \{I, N, U\}} \frac{s_{Kj}^Q}{1 - s_{\Pi}^Q} \times d \ln K^j$$

- “Modified” calculation differs across our three cases

## Naive vs. Modified TFP



- Two series most closely correspond for case *R*



# Agenda

- Notation and Data
- (Almost) Model-free Analysis
  - *Case  $\Pi$*  , with discussion of De Loecker and Eeckhout (2017)
  - *Case  $K$* , and
  - *Case  $R$*
  - TFP Comparison
- **Model, Calibration, and Counterfactuals**

# Model

- Business sector:  $L, K^I, K^N, K^U \rightarrow C, X^I, X^N, X^U, X^H$
- Housing sector:  $K^H \rightarrow H$
- Representative workers work and consume  $(C, H)$  using wages
- Representative capitalists lease capital, invest, consume  $(C, H)$  using rental income
- Perfect foresight and exogenous real interest rate path
- Purpose of model is to understand how shocks and their impact differ across our three cases

## Model

- $C_t, X_t^j, H_t$  are CES aggregates of intermediate varieties
- Intermediates produced with CES technology:

$$Q_t = \left( \alpha \left( A_t^K K_t^Q \right)^{\frac{\sigma-1}{\sigma}} + (1-\alpha) \left( A_t^L L_t \right)^{\frac{\sigma-1}{\sigma}} \right)^{\frac{\sigma}{\sigma-1}}$$

- Labor rented at wage  $W_t$
- Capital bundle:

$$K_t^Q = \left( \sum_{j \neq H} \left( \nu_t^j \right)^{\frac{1}{\theta}} \left( K_t^j \right)^{\frac{\theta-1}{\theta}} \right)^{\frac{\theta}{\theta-1}}$$

rented at rate:

$$R_t^Q = \left( \sum_{j \neq H} \nu_t^j \left( R_t^j \right)^{1-\theta} \right)^{\frac{1}{1-\theta}}$$

# Model

- Relative prices from productivity in final good production
- Markups from elasticity of substitution in those processes
- Workers and capitalists are Cobb-Douglas in  $C_t$  and  $H_t$
- Capitalists' FOC yields formula for  $R_t^j$  used above

# Quantification

- Exogenous processes taken straight from data:

$$\{\tau S, L_t, \delta_t^j, \xi_t^j, \mu_t^Q, \mu_t^H\}$$

- Extracted processes to match rest of data:

$$\{\beta_t, A_t^L, A_t^K, \nu_t^j, A_t^H\}$$

- Equilibrium requires sequence of prices and quantities:

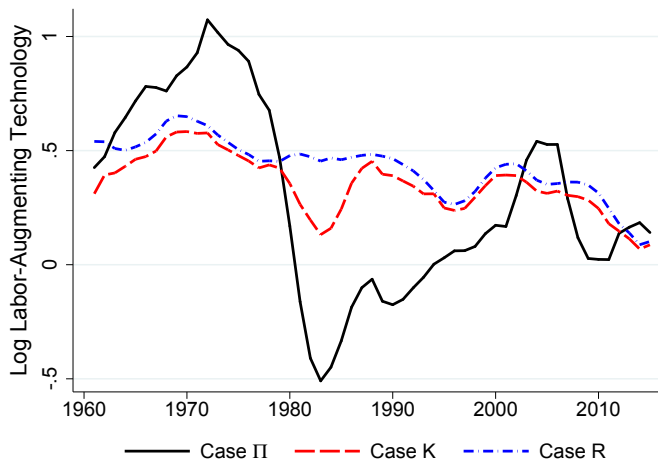
$$\text{Prices: } \{W_t, R_t^j, P_t^H\}$$

$$\text{Quantities: } \{H_t^L, H_t^K, H_t, C_t^L, C_t^K, Q_t, K_t^j, X_t^j, D_t\}$$

- Reaches BGP with values equal to factual at end of data
- Match data during 1960-2016 under each of the three cases

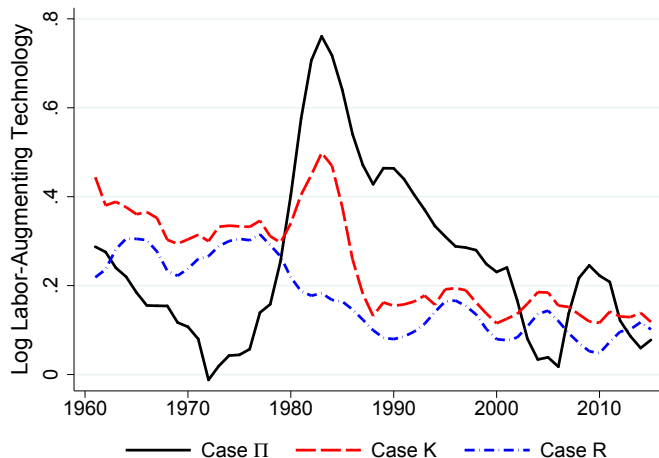
# Extracted Labor-Augmenting Technology

$$\sigma = 1.25 \quad A_t^L = (1 - \alpha)^{\frac{\sigma}{1-\sigma}} \left( s_{L,t}^Q \right)^{\frac{1}{\sigma-1}} \left( \mu_t^Q \right)^{\frac{\sigma}{\sigma-1}} W_t$$



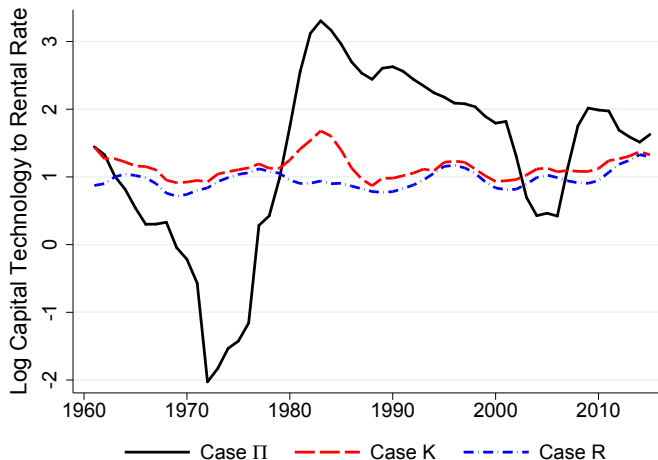
# Extracted Labor-Augmenting Technology

$$\sigma = 0.75 \quad A_t^L = (1 - \alpha)^{\frac{\sigma}{1-\sigma}} \left( s_{L,t}^Q \right)^{\frac{1}{\sigma-1}} \left( \mu_t^Q \right)^{\frac{\sigma}{\sigma-1}} W_t$$



# Extracted Capital-Augmenting Technology

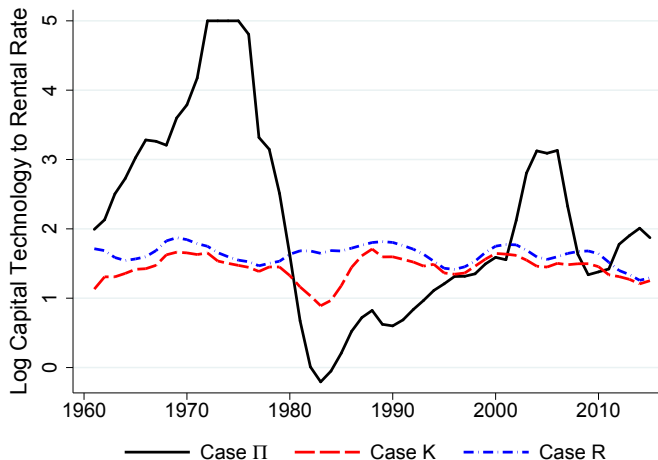
$$\sigma = 1.25 \quad A_t^K / R_t^Q = \alpha^{\frac{\sigma}{1-\sigma}} \left( s_{K,t}^Q \mu_t^Q \right)^{\frac{1}{\sigma-1}} \mu_t^Q$$





# Extracted Capital-Augmenting Technology

$$\sigma = 0.75 \quad A_t^K / R_t^Q = \alpha^{\frac{\sigma}{1-\sigma}} \left( s_{K,t}^Q \mu_t^Q \right)^{\frac{1}{\sigma-1}} \mu_t^Q$$



# Counterfactuals: Examples of How the Cases Matter

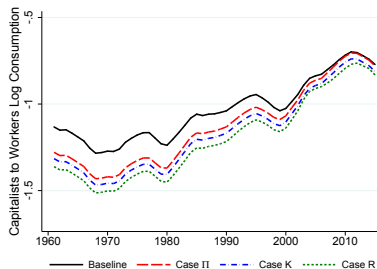
Changes (1986-1990 vs. 2011-2015) in  $s_L^Q$

	Elasticity $\sigma = 1.25$			Elasticity $\sigma = 0.75$		
	Case $\Pi$	Case $K$	Case $R$	Case $\Pi$	Case $K$	Case $R$
<b>Baseline</b>	<b>-0.030</b>	<b>-0.029</b>	<b>-0.030</b>	<b>-0.030</b>	<b>-0.029</b>	<b>-0.030</b>
$\mu^Q$	-0.071	0.000	0.000	-0.083	0.000	0.000
$\xi^I$	-0.016	-0.016	-0.021	0.019	0.018	0.024
$(A^K, \nu^I)$	0.041	-0.056	-0.048	0.063	0.025	-0.003
$\xi^N$	-0.002	-0.002	0.009	0.002	0.002	-0.008
$(A^K, \nu^N)$	0.075	0.009	-0.035	0.023	-0.094	-0.024
$\tau^k$	0.000	-0.012	0.002	0.000	0.011	-0.001

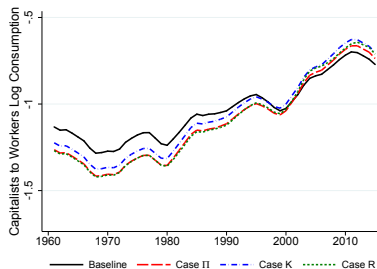
# Counterfactuals: Examples of When Cases Don't

Changes (1986-1990 vs. 2011-2015) in  $\ln(C_K/C_L)$

$\sigma = 1.25$



$\sigma = 0.75$



- Same for implications on GDP growth (see paper)

# Conclusions

- Skeptical of *Case Π* :
  - Two (negatively correlated) shocks, not one
  - Requires longer view than just early-1980s onward
- A bit less skeptical of *Case K* : Our version requires too much  $K^U$  early-on, but other versions might do better
- Most optimistic about *Case R* : But what is source of wedge?
- For many questions – including cause of  $s_L$  decline, but also **much** more! – interpretation of factorless income matters
- Hope to see explorations of factorless income around the world