

# The Myth of Post-Reform Income Stagnation in Brazil

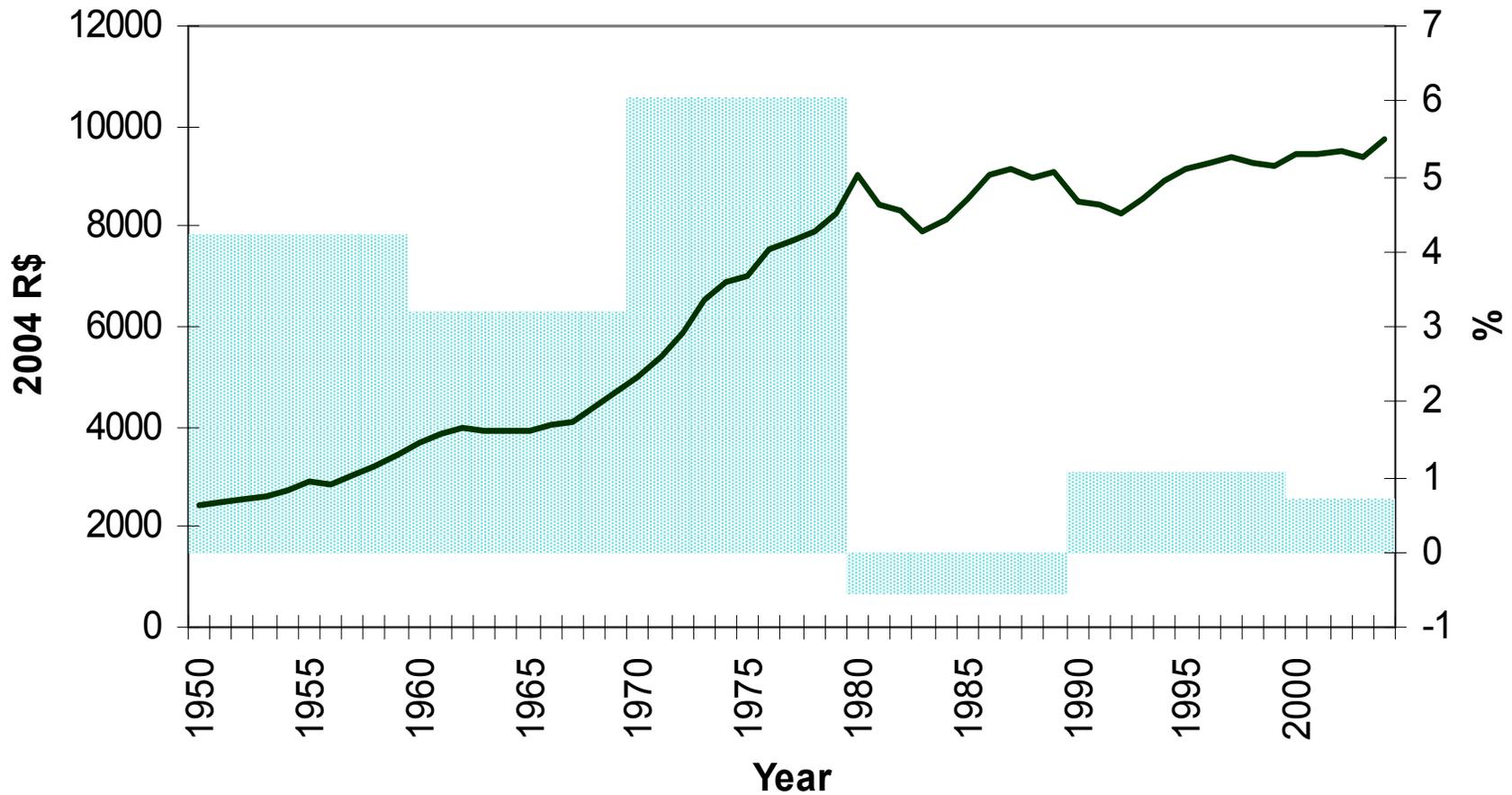
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# Brazil reformed...

- Brazil in the 80s
  - Hyperinflation
  - Very closed economy; average tariff
  - SOEs
- Brazil in mid 90s
  - Inflation in single digits
  - Relatively open; average tariff at about 10 percent
  - Some privatization, more about to come

# And so Brazil has taken off...



Conventional wisdom:

Post-reform growth was  
disappointing

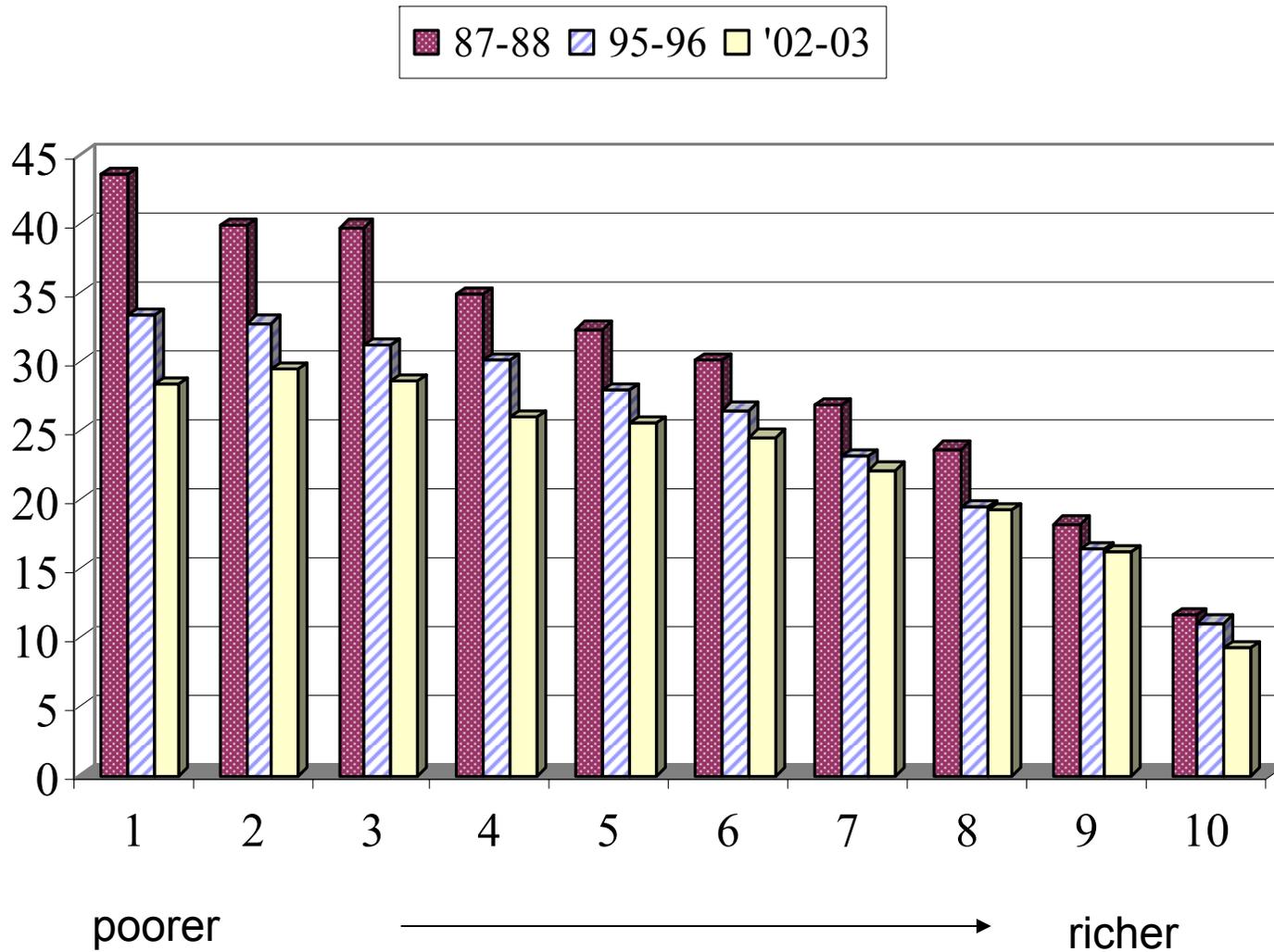
# Puzzle: Low growth after successful reforms

- Trade liberalization, privatization, reduction in inflation, democracy, better fiscal institutions were not enough to jumpstart growth!
- Intriguing:
  - Limited or no push back against reforms!

# This paper:

- Analyzes household consumption and income data
- Finds:
  - household per capita real income increased by modest 1.5 percent per year
  - But large changes in consumption patterns imply greater improvements in real income

# Food shares have declined for all expenditure deciles in Brazil...



# A Solution for Brazilian Growth Puzzle:

The conventional wisdom is wrong!

Claim: Brazil's post-reform real income  
and expenditure growth have been  
underestimated due to CPI bias

# Sources of CPI bias

- Substitution bias
  - Consumers substitute away from goods whose relative prices increase
- New goods
  - Typically very expensive at first, then become affordable. The longer the lag for inclusion in the CPI basket the larger the bias
    - (E.g. cell phones and PCs only introduced in 1999, based on their weight in the 1995-96 basket)
- Better goods
  - CPI typically fails to account for quality improvement
    - (E.g. 286 PC worthless today)

All likely  
relevant  
during trade  
liberalization

Relevant for CPI bias between 87/88 and 02/03

# Sources of CPI bias

- Hyperinflation

Middle class, rich use ATM card, cheques, interest-bearing bank account; poor hold cash

- During hyperinflation, \$100 in the hands of a richer person purchased **more** than \$100 in the hands of a poor one because the latter paid more inflation tax.
- Neri (1995): when inflation is 40 percent/month, real income falls by 9 percent for consumer without access to interest-earning account.

Relevant for CPI bias between 87/88 and 95/96

# Data: Household Income and Expenditure Data from POF Survey

- Surveys conducted over:
  - March 1987-February 1988 (pre-reform)
  - October 1995-September 1996 (post-reform)
  - July 2002-June 2003 (post-reform)
- Probabilistic sample, stratified by income, good quality data
- Each survey deflates income and expenditures to same reference date (using item specific deflators)
- Expenditure does not include rental value of owner-occupied houses

# Data: Household Income and Expenditure Data from POF Survey

- Expenditure information is collected using different questionnaires:
  - Everyday collective (food, cleaning materials) and individual expenditures (e.g. food outside) are reported on a notebook for a week;
  - Infrequent expenditures are reported using different recall windows (1 to 12 months).
  - Each expenditure is then deflated and annualized.
- 10 metropolitan areas, representative of CPI target population (only in 2002-03 POF was nationally representative)

# Results for different samples

- Full sample

- “Compliant” sample:

  - Excludes 1-2 percent of non-compliant households that report no expenditure in the weekly notebook

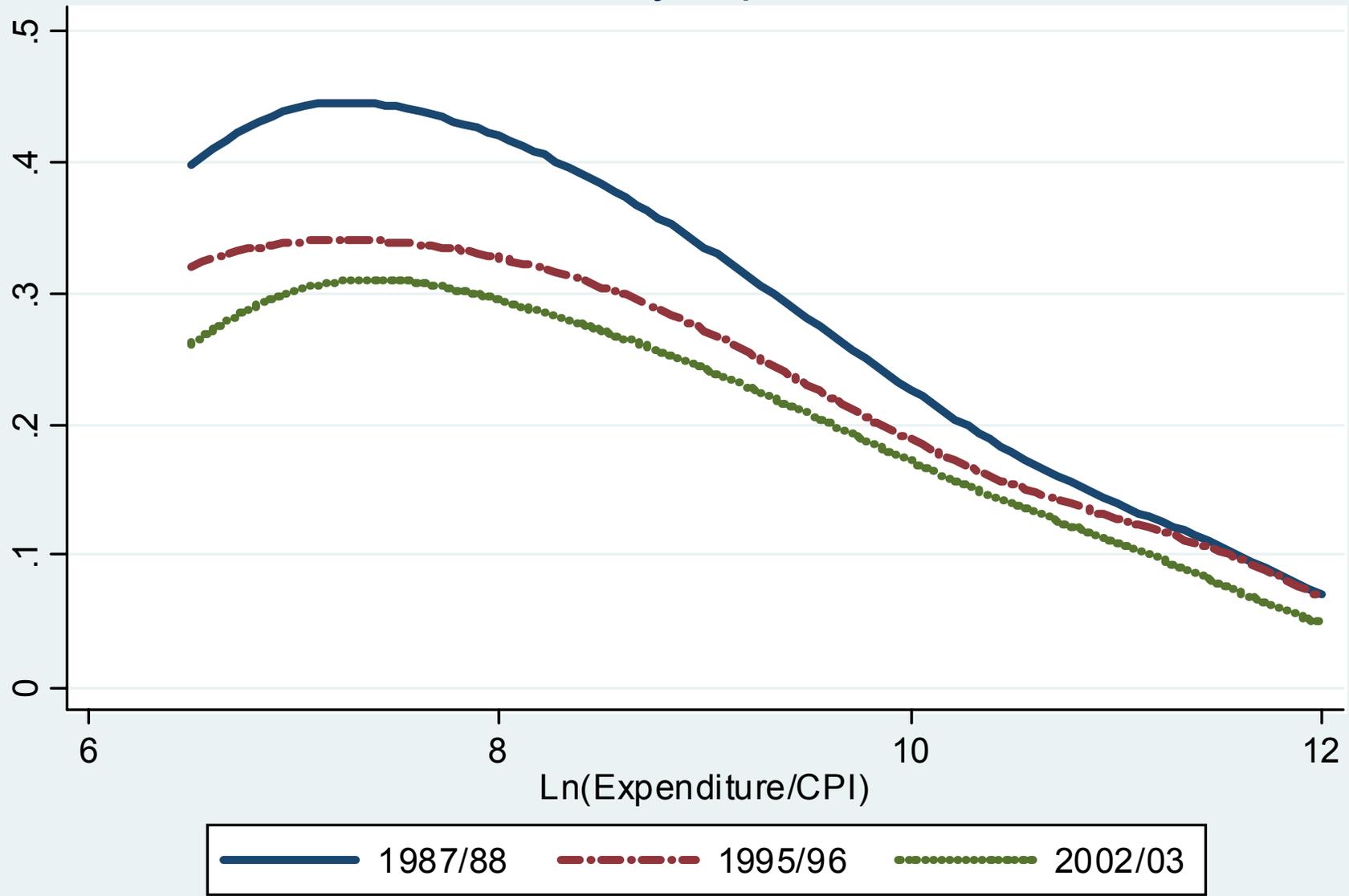
- Winsorized sample:

  - Food consumption and total expenditure below 5 percentile and above 95 percentile is recoded to those percentiles (useful for robustness check)

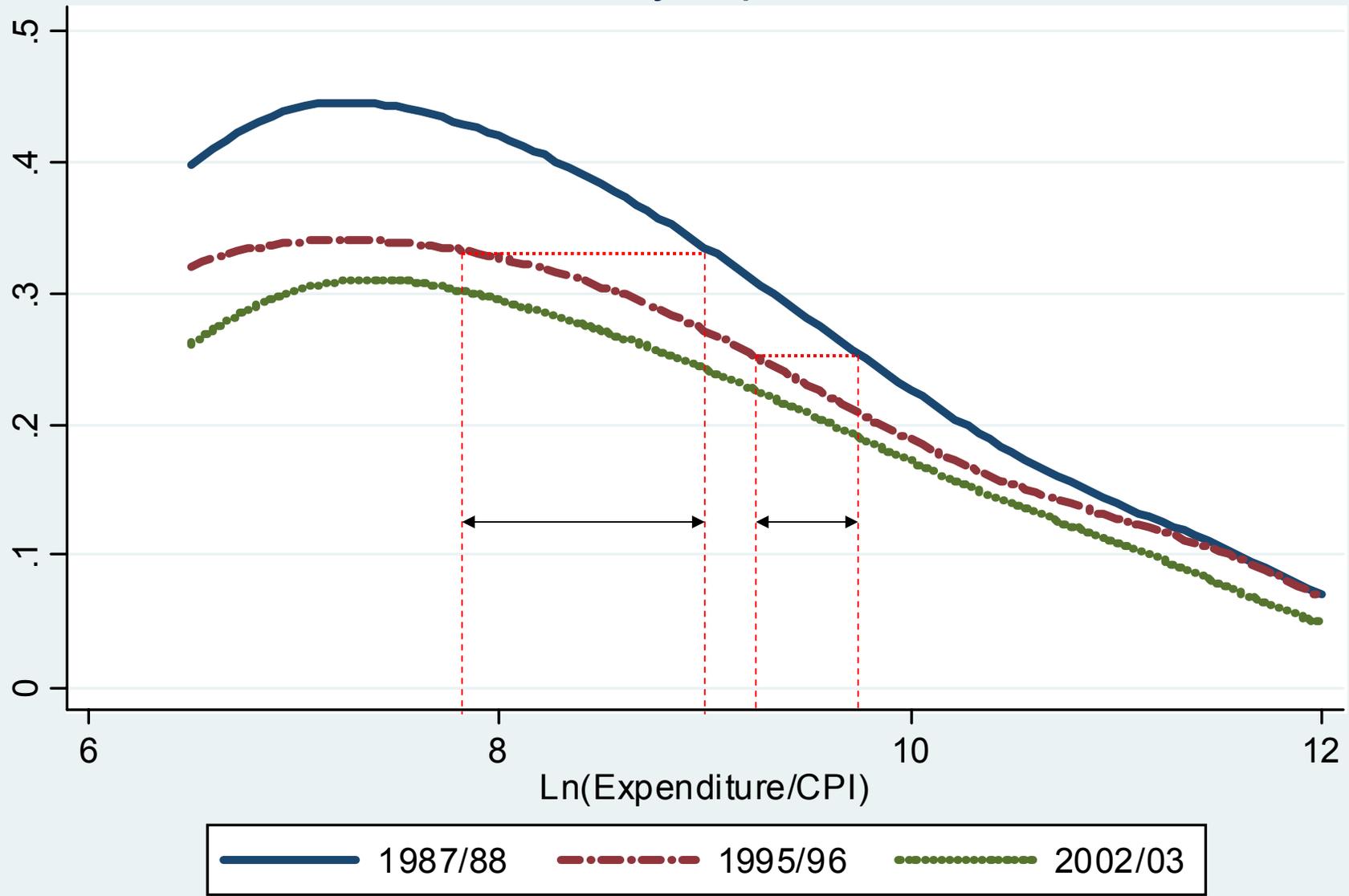
- Tenants sample:

  - Expenditure data does not cover rental value of owner-occupied homes; hence interesting to check if results hold for the tenants sub-sample

# Food share, by expenditure level



# Food share, by expenditure level



# Linear specification

$$w_{i,j,t} = \phi + \delta_t + \gamma(\ln P_{F,j,t} - \ln P_{N,j,t}) + \beta(\ln Y_{i,j,t} - \ln P_{G,j,t}) + \sum_x \theta_x \mathbf{X}_{i,j,t} + \mu_{i,j,t}$$

$w$  is share of food for household  $i$  in region  $j$  at time  $t$   
 $P_F$ ,  $P_N$  and  $P_G$  are the true but unobservable price indices of food, nonfood and all goods  
 $Y$  is household nominal income  
 $X$  is vector of household characteristics

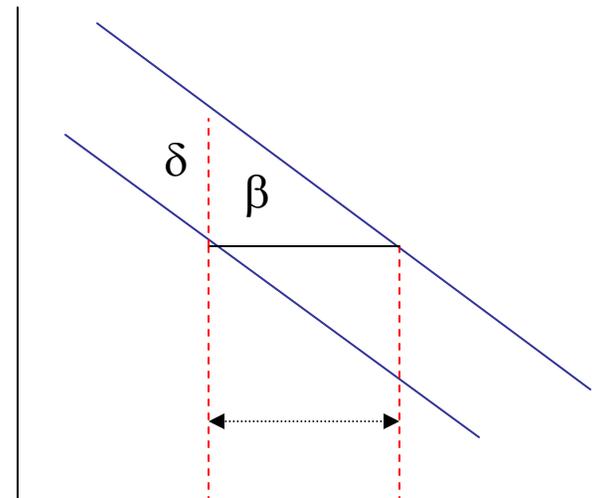
Bias is determined by parameters  $\beta$  and  $\delta$  for the linear case

$$\delta_t = \gamma(\ln(1 + E_{F,t}) - \ln(1 + E_{N,t})) - \beta \ln(1 + E_{G,t})$$

If  $\gamma$  is positive and “small”, one can show that

$$\ln(1 + E_{G,t}) = -\delta_t / \beta$$

is an underestimate for the actual bias



# Linear specification

		(1)	(2)	(3)	(4)
		<b>Tenant-OLS</b>	<b>Tenant-IV</b>	<b>Full-OLS</b>	<b>Full-IV</b>
Dummy for 1996	$\delta$	-0.049 [0.016]	-0.047 [0.017]	-0.043 [0.012]	-0.039 [0.013]
Dummy for 2003		-0.050 [0.019]	-0.047 [0.020]	-0.064 [0.013]	-0.057 [0.013]
Ln(Relative price of food)	$\gamma$	0.031 [0.050]	0.035 [0.054]	0.002 [0.038]	0.041 [0.038]
Ln (Expenditure/CPI)	$\beta$	-0.056 [0.005]	-0.076 [0.005]	-0.072 [0.003]	-0.093 [0.004]
Observations		6753	6753	32681	32681
R-squared		0.224	0.210	0.295	0.283
<b>Cumulative bias 87-96 (%)</b>		<b>58.82 [13.46]</b>	<b>45.73 [13.45]</b>	<b>44.41 [9.46]</b>	<b>34.04 [9.35]</b>
<b>Annual equivalent 87-96 (%)</b>		<b>9.82</b>	<b>6.87</b>	<b>6.61</b>	<b>4.73</b>
<b>Cumulative bias 96-03 (%)</b>		<b>1.08 [14.80]</b>	<b>0.40 [11;64]</b>	<b>25.30 [5.65]</b>	<b>18.07 [4.41]</b>
<b>Annual equivalent 96-03 (%)</b>		<b>0.16</b>	<b>0.06</b>	<b>4.23</b>	<b>2.91</b>
Mean Dependent Variable:		0.237	0.237	0.264	0.264

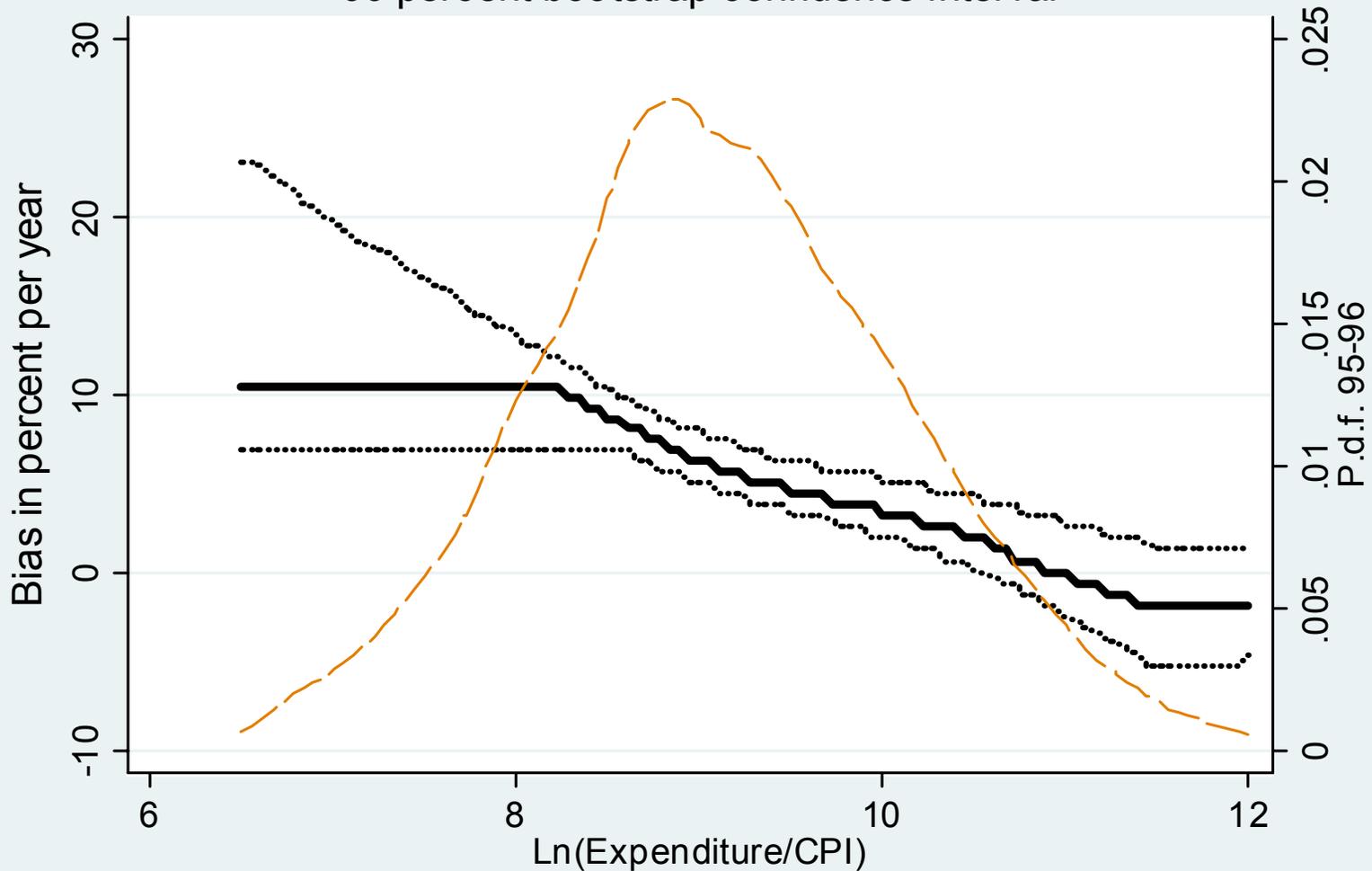
Notes: Robust standard errors in brackets. Controls include demographic, labor participation, family characteristics and regional dummies. Total income is used as an instrument to total expenditure in the IV regressions.

# But bias may vary across expenditure distribution

- Different effects of high inflation
  - poor more vulnerable to inflationary tax
- Different composition of consumption basket
  - poor more heavily into traded goods

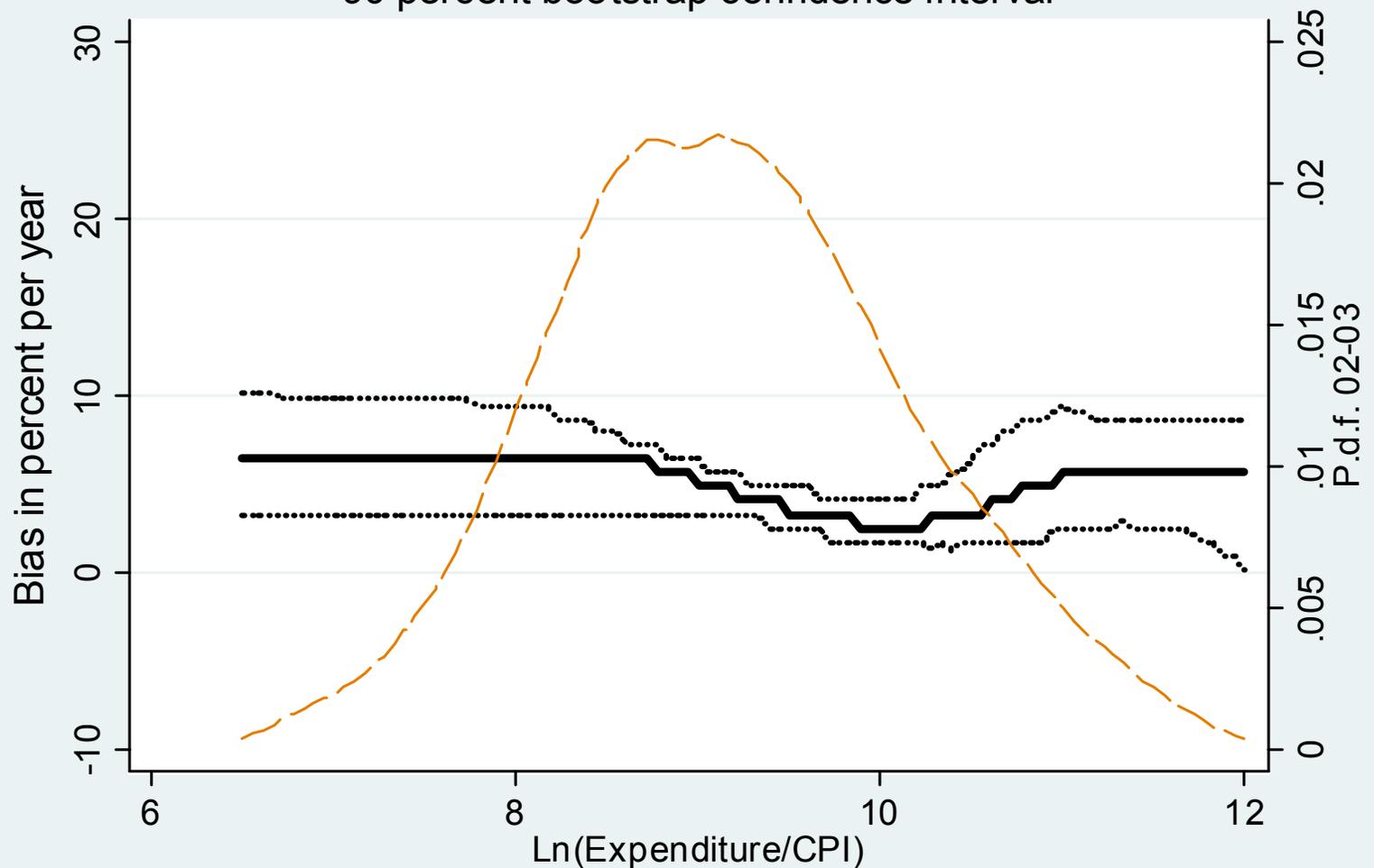
# Bias 1987/88 – 1995/96

Annual bias 87/88-95/96, by expenditure level  
90 percent bootstrap confidence interval



# Bias 1995/96 – 2002/03

Annual bias 95/96-02/03, by expenditure level  
90 percent bootstrap confidence interval



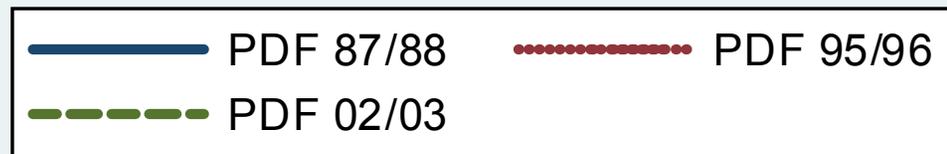
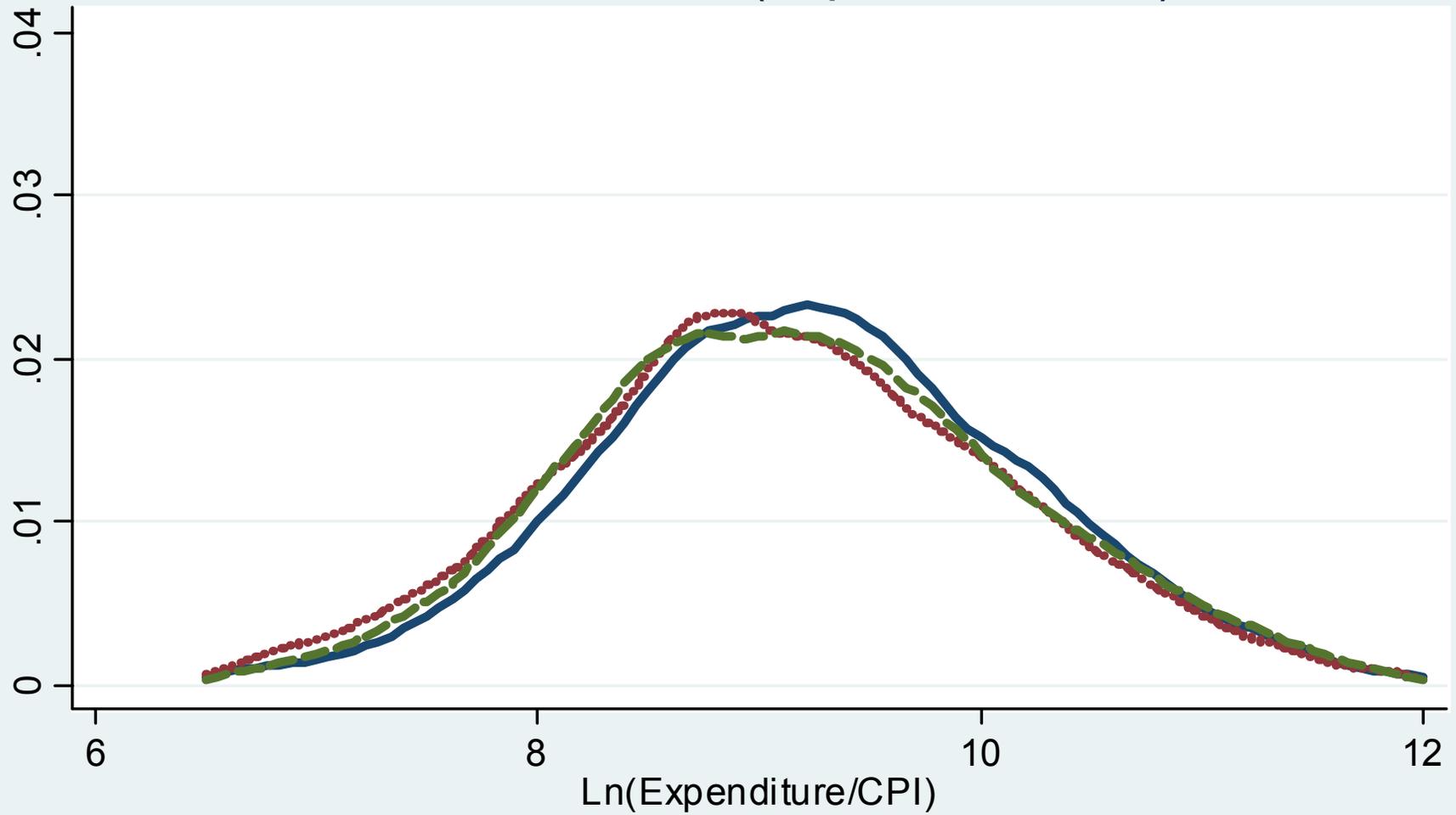
# Semi-parametric bias estimates

(95 percent bootstrap confidence intervals)

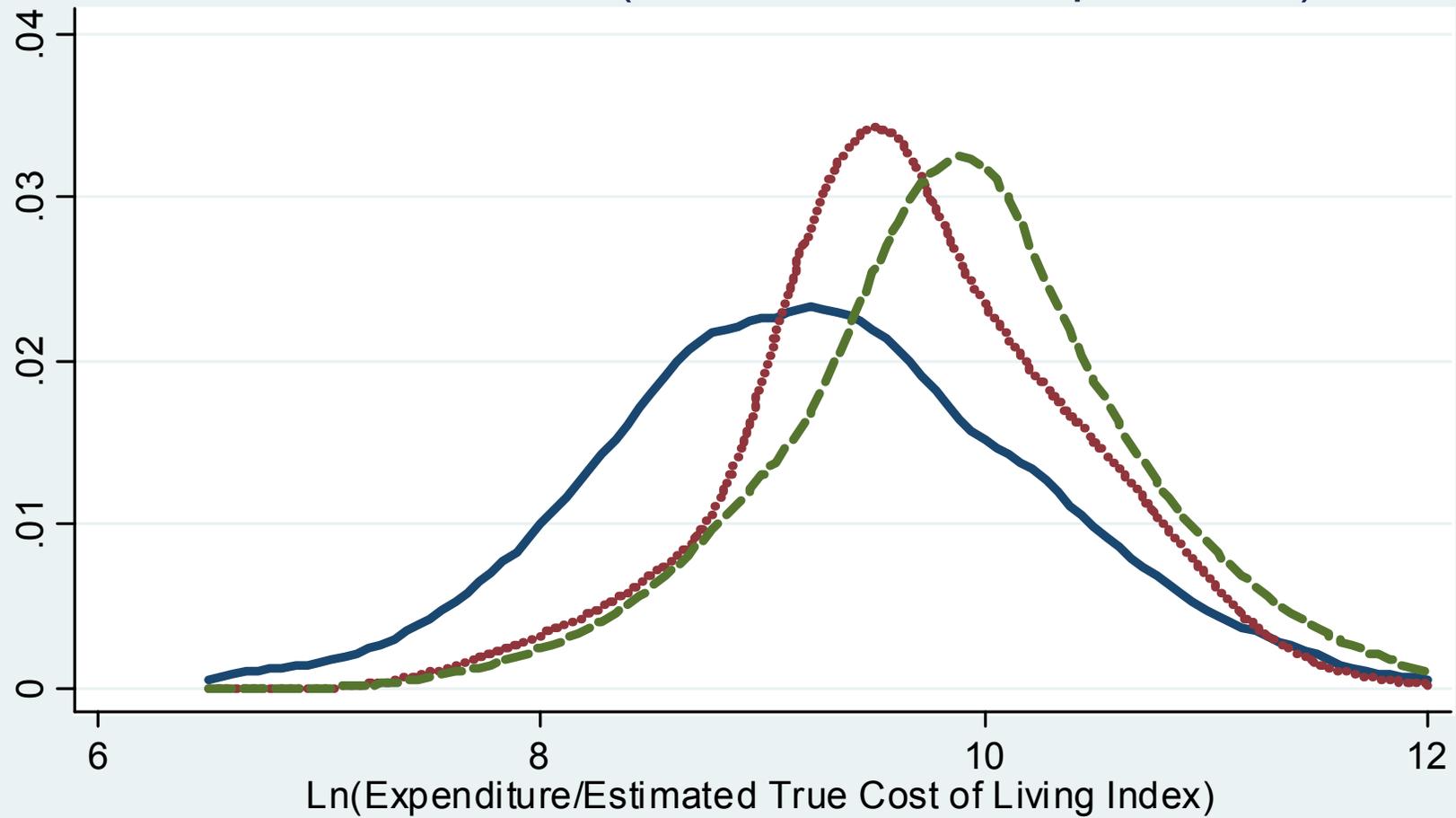
- Bias for the average household:
  - 1987/88-1995/96: 6.1% [4.3% - 8.2%]
  - 1995/96-2002/03: 4.9% [2.9% - 6.3%]
- Aggregate bias (households weighted by expenditure):
  - 1987/88-1995/96: 2.8% [0.9% - 5.3%]
  - 1995/96-2002/03: 4.3% [2.4% - 6.2%]
    - But alternative definition of non-compliance and a robust estimator that downplays the role of outliers lowers aggregate bias estimates to 3%

# Implications for Inequality

## Distribution of Ln(Expenditure/CPI)



## Distribution of Ln(Corrected Real Expenditure)



# Implications for inequality

Table 6. Expenditure Inequality Corrected for CPI Bias: Expenditure Gini Coefficients

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Panel I: Gini coefficients based on CPI deflated expenditures

1987/88	0.456
1995/96	0.469
2002/03	0.462

Panel II: Gini coefficients based on expenditures correcting for the CPI bias

1987/88	0.456
1995/96	0.318
2002/03	0.335

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Notes: Based on semi-parametric bias estimates from the compliant sample.

Table 5. Household Per Capita Expenditure and Net Income: Headline and Corrected, in 1996 R\$

# Bottom line

**Per capita household net income:**

**Growth of 4.5 percent instead of 1.5 percent over the last 15 years!**

**More so for the poor!**

**Much of the post-reform debate may have been misled by measurement problems**

		1987-88	1996-95	2002-03	Annual percent change
<i>Using official CPI as the deflator</i>					
Household per capita expenditure	Mean	5,003	5,219	5,985	1.2
	Median	2,748	2,646	2,976	0.5
	Bottom 20%	790	701	850	0.5
	Top 20%	14,928	16,463	18,874	1.5
Household per capita net income	Mean	5,461	4,935	6,610	1.3
	Median	2,912	2,569	2,821	-0.2
	Bottom 20%	1,145	1,151	1,152	0.0
	Top 20%	15,379	13,560	20,325	1.8
<i>Correcting for estimated CPI bias</i>					
Household per capita expenditure	Mean	4,067	5,219	7,914	4.4
	Median	1,723	2,646	3,942	5.5
	Bottom 20%	335	701	1,143	8.3
	Top 20%	14,604	16,463	24,940	3.6
Household per capita net income	Mean	4,125	4,935	8,359	4.7
	Median	1,773	2,569	3,711	4.9
	Bottom 20%	462	1,151	1,548	8.2
	Top 20%	14,500	13,560	26,219	3.9

Notes: Based on estimates of the semi-parametric specification in the “compliant” sample. The bottom and top 20% refer to quintiles of expenditure per survey year in the “compliant” sample.

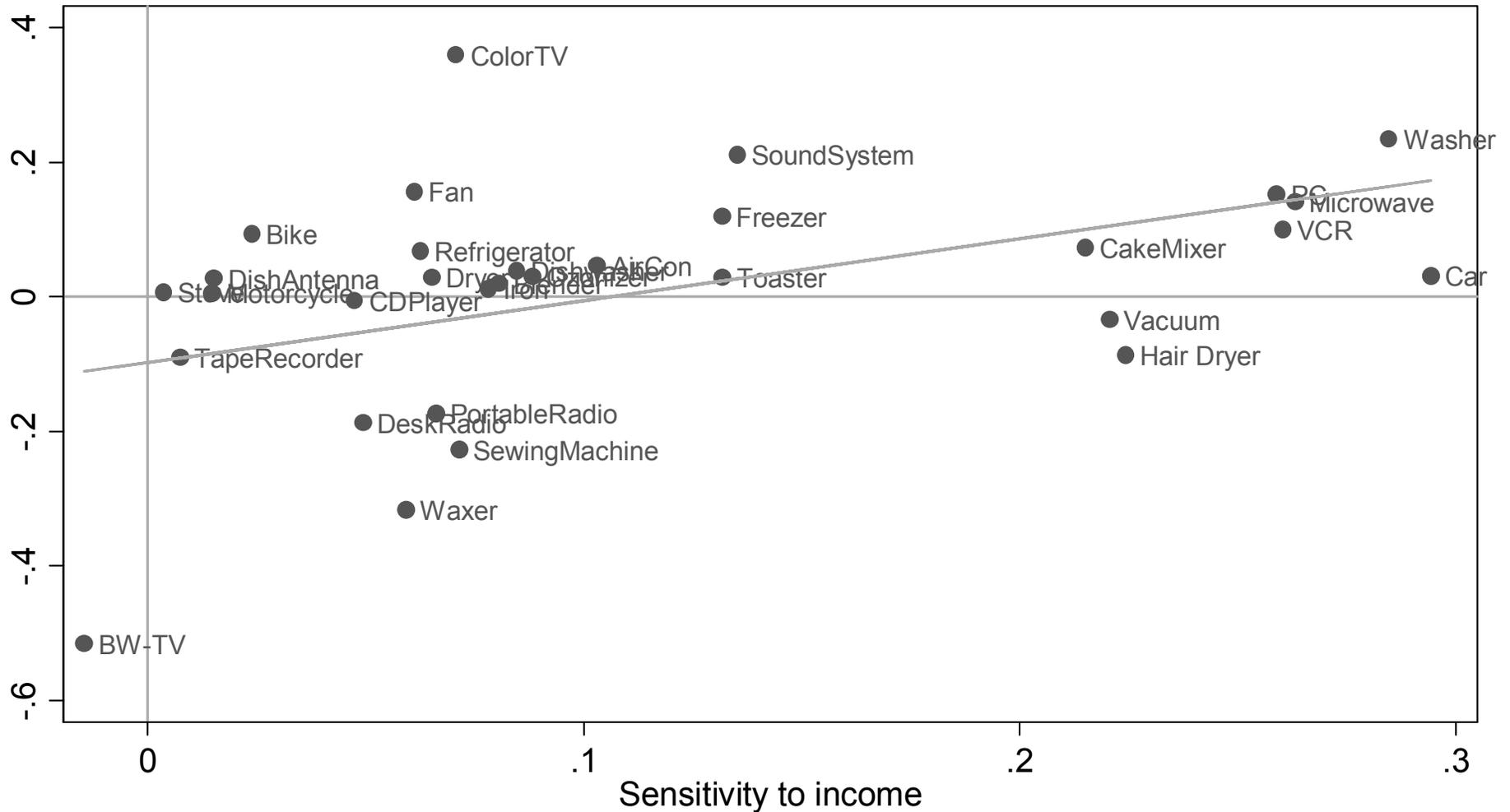
Further evidence:  
Durable goods ownership

# Evidence for durable goods

- For each durable good, calculate how probability of ownership increases with income
- Then for each good, compare how increase in ownership is correlated with “sensitivity to income”

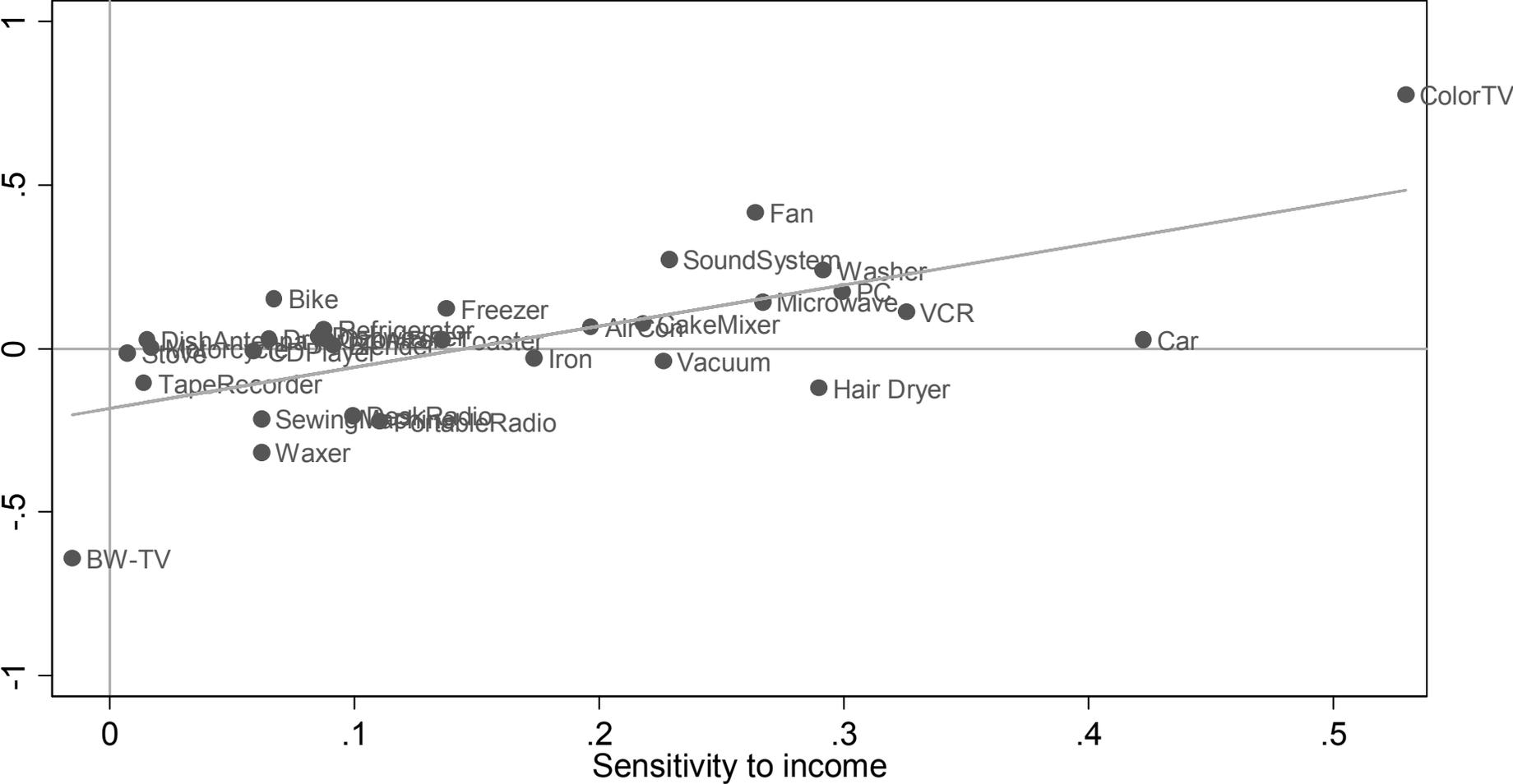
*When we “forecast” income growth based on growth in the demand for durables, controlling for changes in relative prices, real income growth between 1987-88 and 2002-03 is more than 100%*

# Increase in ownership stronger for goods more sensitive to income



● Change in % own 1988-02      — Linear prediction

# Increase in average holdings stronger for goods more sensitive to income



● Chg avg holdings 1988-02      — Linear prediction

# Further evidence: Anthropometrics

# Brazil converging to international standards of children's height for age

Table 8. Anthropometric Measures for Children 0-60 months old.

Year	Sample	Height for Age		Real Minimum Wage (in 2006 R\$)
		Percentage Below 3 Std. Dev. from U.S.	Percentage Below 2 Std. Dev. from U.S.	
		Median	Median	
1975	National	14.2	32.0	310.78
	Urban	10.0	25.9	
1989	National	4.2	15.4	238.48
	Urban	3.0	12.3	
1996	National	2.5	10.5	212.68
	Urban	1.6	7.8	

Note: Anthropometric Data from the World Health Organization Global Database on Child Growth and Malnutrition. Real minimum wage data from IPEADATA.

What does the result tell about  
growth regressions?

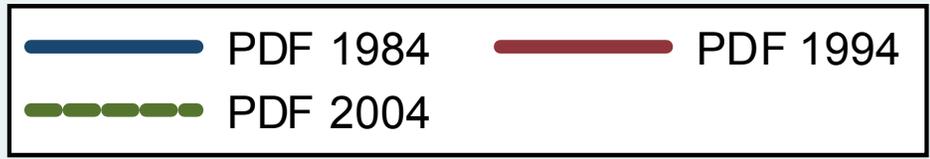
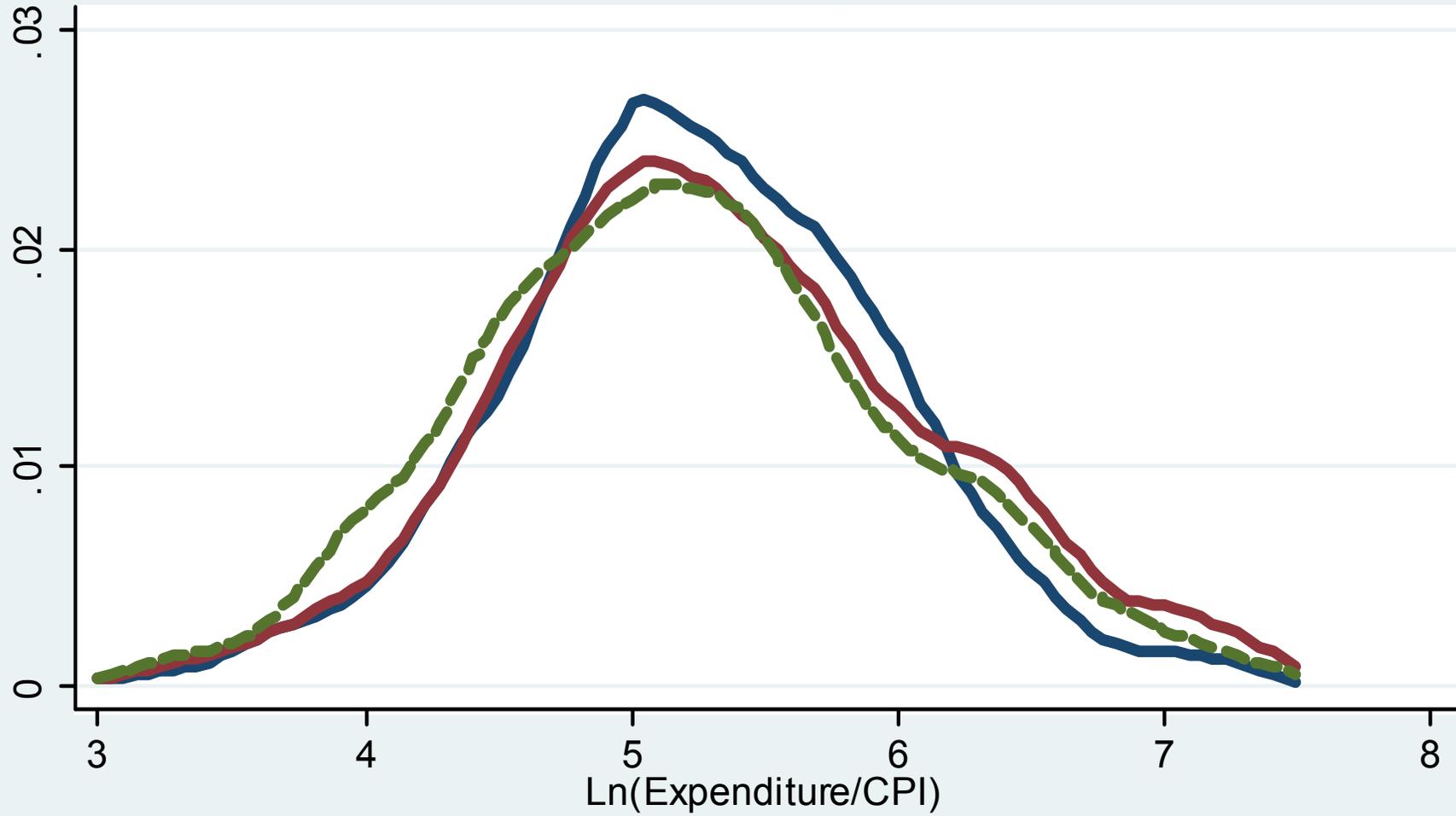
Is Brazil unique?

# Mexico:

## Semi-parametric bias estimates

- Bias for the average household:
  - 1984-1994: 2.7%
    - 1989-1994: 2.8%
  - 1994-2004: 2.4%
- Aggregate bias (households weighted by expenditure):
  - 1984-1994: 1.6%
    - 1989-1994: 3.1%
  - 1994-2004: 1.4%

# Distribution of Ln(Expenditure/CPI)



## Distribution of Ln(Corrected Real Expenditure)

