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DEGLI STUDI  
DI PADOVA

# *What causes global recessions? A quantile regression approach*

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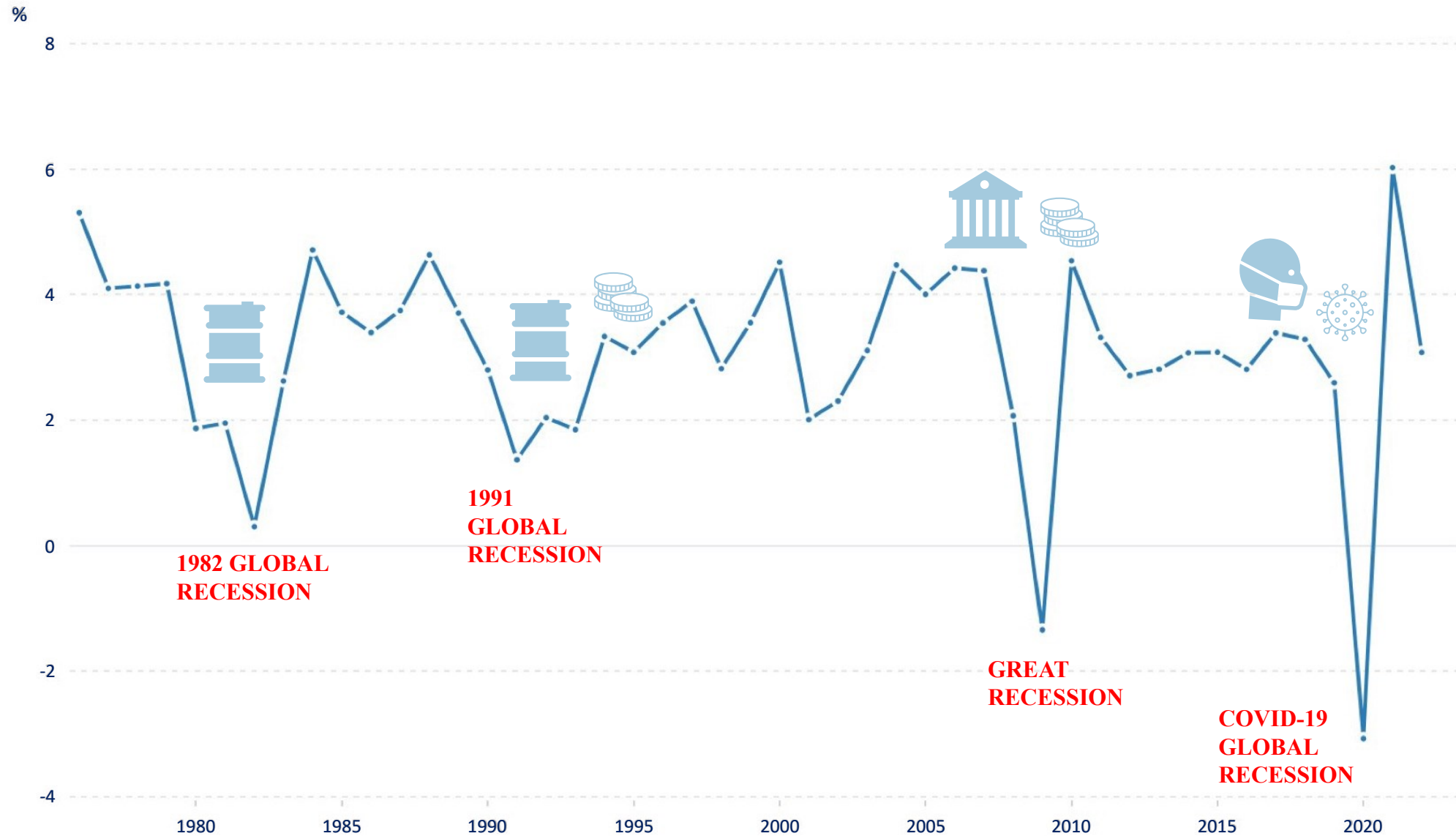
*Master's Degree in Economics and Finance MEF  
Thesis Defence - Third Period A  
A. Y. 2022/2023*

16<sup>th</sup> October 2023



- Introduction
- Data and Methodology
  - Preselection of variables
  - Quantile regression approach
- Empirical results
- Conclusion

GDP growth (annual %) | Data (worldbank.org)



Which variables are *informative indicators* of **GLOBAL RECESSIONS**?

# Framework

**Monthly** observations

First sample: **June 1976 – December 2019**

Second sample: **June 1976 – December 2022**

Forecast horizons: **one quarter** and **one year** ahead

Measure of **GLOBAL ECONOMIC ACTIVITY**:

**WORLD INDUSTRIAL PRODUCTION GROWTH**

**PREDICTORS** suggested by the financial literature and economic theory:

VXO spliced

WTI

Excess Bond Premium

Effective Federal Funds Rate  
and  
Shadow Federal Funds Rate

U.S. Term Spread

- ❖ Oil Supply Shocks
- ❖ Oil Consumption Demand Shocks
- ❖ Oil Inventory Demand Shocks

Real Commodity Price Factor

# Preselection of variables

**OLS FORECASTING REGRESSION:**  $y_{t+i} = \beta_0 + \beta_1 x_t + e_{t+i}$

where  $i = 3, 12$

**First sample:** June 1976 – December 2019

Variables	(1) OECD + 6NME IP GR <sub>t+3</sub>	(2) OECD + 6NME IP GR <sub>t+12</sub>
VXO spliced <sub>t</sub>	<b>-0.15003***</b> (0.017205)	-0.026976 (0.018305)
EFFR + SFFR <sub>t</sub>	0.008997 (0.031092)	<b>-0.082807***</b> (0.030737)
WTI <sub>t</sub>	<b>-0.012855**</b> (0.0051162)	<b>-0.038638***</b> (0.0048338)
OSS <sub>t</sub>	<b>-0.18407*</b> (0.097494)	0.017827 (0.098173)
OCDS <sub>t</sub>	0.031858 (0.039415)	0.049543 (0.039532)
OIDS <sub>t</sub>	0.13975 (0.12741)	-0.089917 (0.12731)
RCPF <sub>t</sub>	<b>2.1495***</b> (0.3073)	<b>1.7023***</b> (0.31121)
EBP <sub>t</sub>	<b>-3.5594***</b> (0.19421)	<b>-1.3938***</b> (0.23992)
T10Y2YM <sub>t</sub>	-0.18498 (0.15237)	<b>0.50305***</b> (0.15082)

**Second sample:** June 1976 – December 2022

Variables	(1) OECD + 6NME IP GR <sub>t+3</sub>	(2) OECD + 6NME IP GR <sub>t+12</sub>
VXO spliced <sub>t</sub>	<b>-0.1499***</b> (0.018025)	0.0099192 (0.019037)
EFFR + SFFR <sub>t</sub>	0.0047134 (0.032726)	<b>-0.082456**</b> (0.032557)
WTI <sub>t</sub>	<b>-0.0097242*</b> (0.0053197)	<b>-0.042088***</b> (0.0052111)
OSS <sub>t</sub>	-0.20492** (0.098132)	-0.040032 (0.098499)
OCDS <sub>t</sub>	<b>0.087519**</b> (0.039601)	0.020405 (0.04)
OIDS <sub>t</sub>	0.04934 (0.1344)	0.011116 (0.13511)
RCPF <sub>t</sub>	<b>2.1942***</b> (0.31774)	<b>1.6972***</b> (0.33185)
EBP <sub>t</sub>	<b>-3.6295***</b> (0.21546)	<b>-1.235***</b> (0.25925)
T10Y2YM <sub>t</sub>	-0.024387 (0.16448)	<b>0.58581***</b> (0.16304)

Standard errors in parentheses

\*\*\* p<0.01, \*\* p<0.05, \* p<0.10

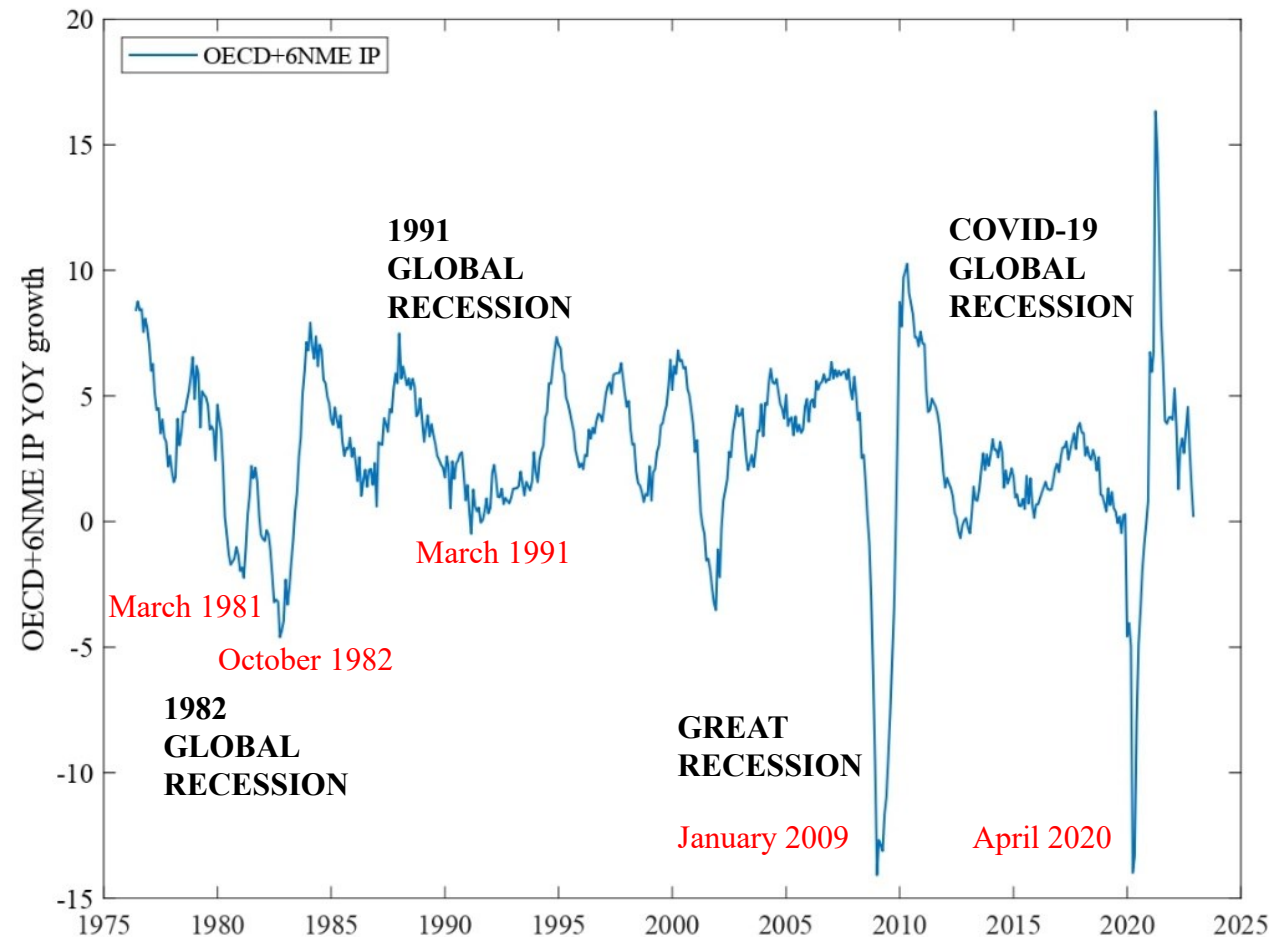
# QUANTILE REGRESSION approach

$$(1) \quad \widehat{\beta}_{\tau} = \arg \min_{\beta_{\tau} \in \mathbb{R}^k} \sum_{t=1}^{T-h} (\tau \cdot \mathbf{1}_{(y_{t+h} \geq x_t \beta)} |y_{t+h} - x_t \beta_{\tau}| + (1 - \tau) \cdot \mathbf{1}_{(y_{t+h} < x_t \beta)} |y_{t+h} - x_t \beta_{\tau}|) \quad \text{where } h = 3, 12$$

$$(2) \quad \widehat{Q_{y_{t+h}|x_t}(\tau|x_t)} = x_t \widehat{\beta}_{\tau}$$

# Date selection

Monthly year-over-year **WORLD INDUSTRIAL PRODUCTION GROWTH RATE** time series



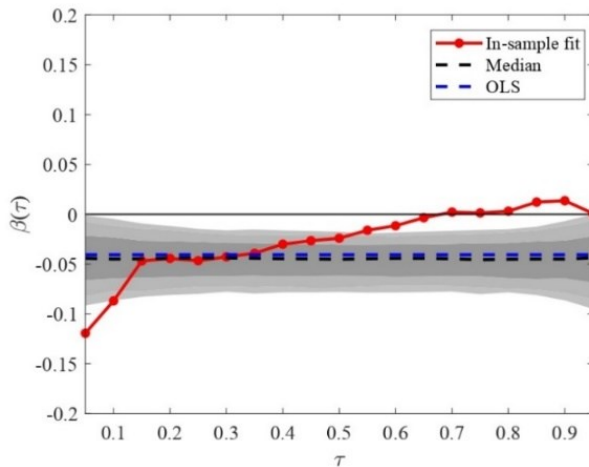
Selected «trough» dates:



# VXO spliced

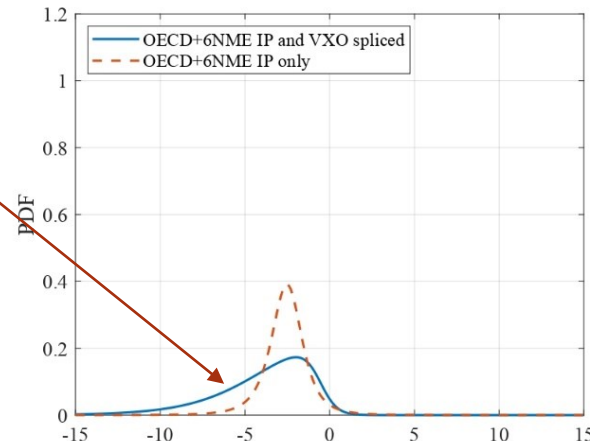
## First sample: *one quarter ahead*

Estimated quantile regression coefficients



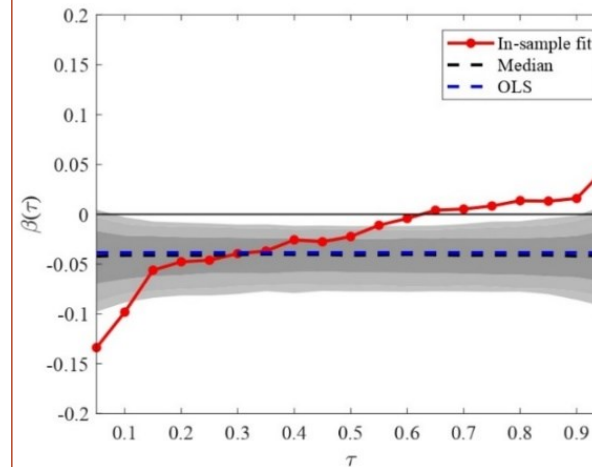
An increase in **financial stress** lowers the mean, expands the variance of the future world industrial production growth distribution, and even skews it to the left

Great Recession,  $t + 3 = \text{January 2009}$

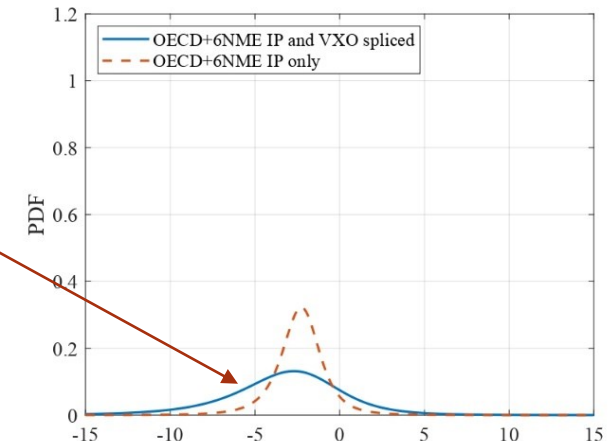


## Second sample: *one quarter ahead*

Estimated quantile regression coefficients



Great Recession,  $t + 3 = \text{January 2009}$

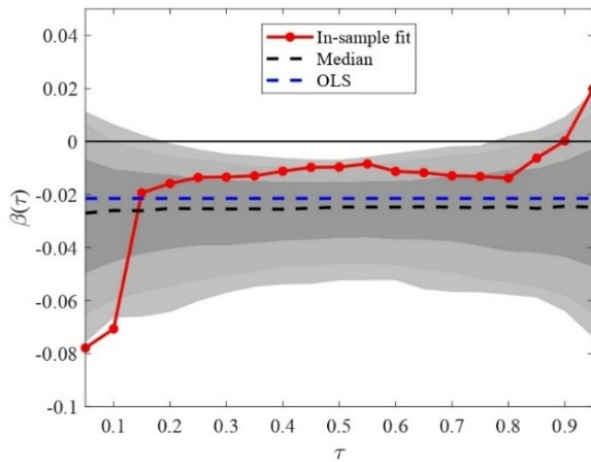
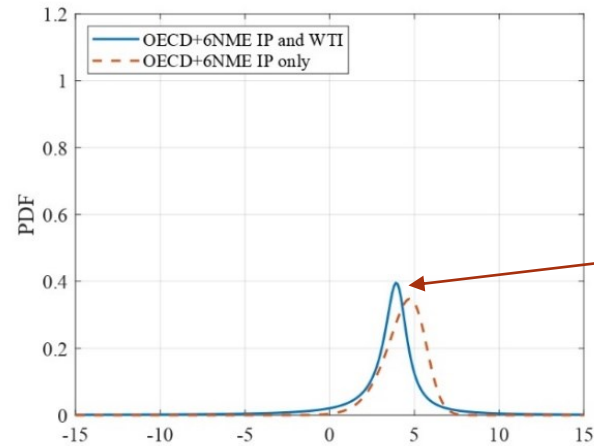


- *First moment effect*
- *Strong second moment effect*
- *No asymmetries*

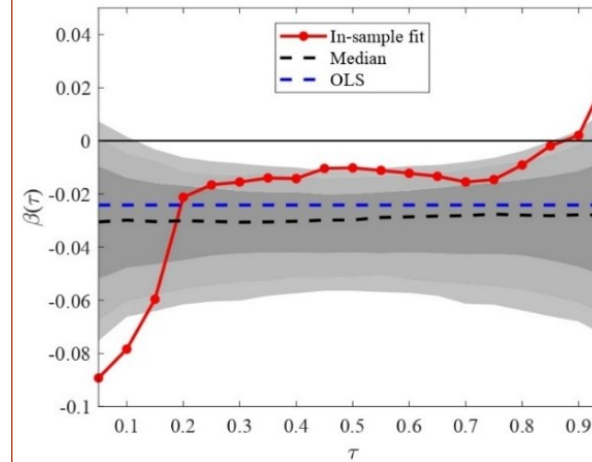
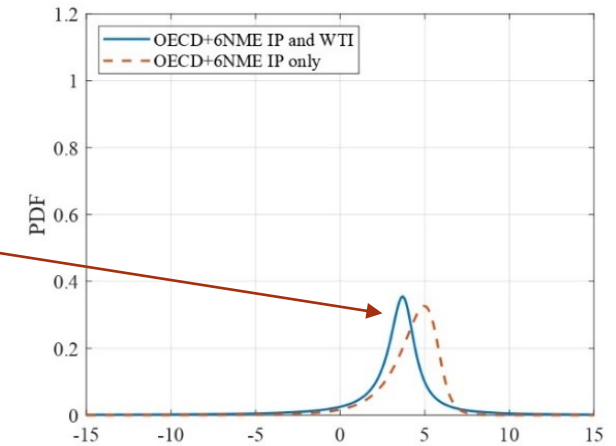
## WTI

First sample: *one year ahead*

Estimated quantile regression coefficients

*Great Recession,  $t + 12$  = January 2009*Second sample: *one year ahead*

Estimated quantile regression coefficients

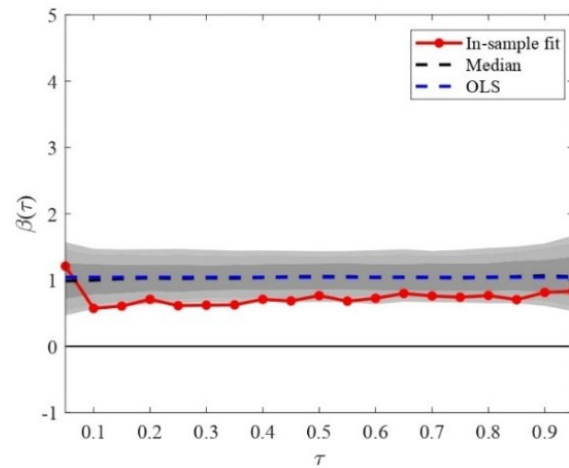
*Great Recession,  $t + 12$  = January 2009*

First moment effect

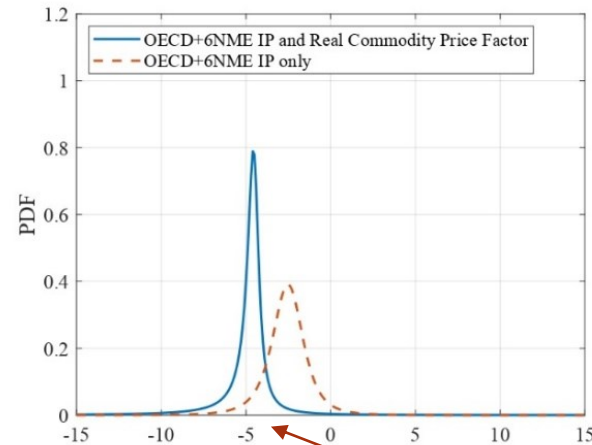
# Real Commodity Price Factor

First sample: one quarter ahead

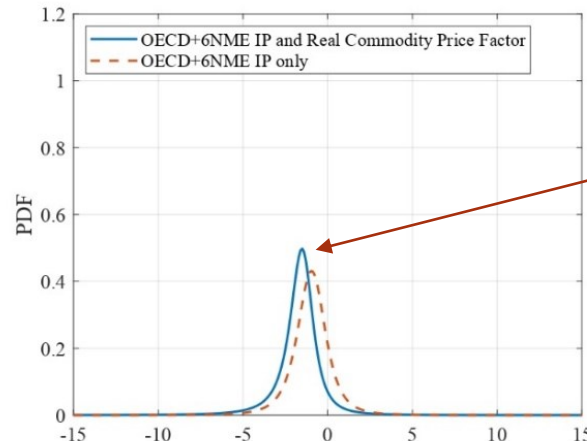
Estimated quantile regression coefficients



*Great Recession*,  $t + 3 =$  January 2009

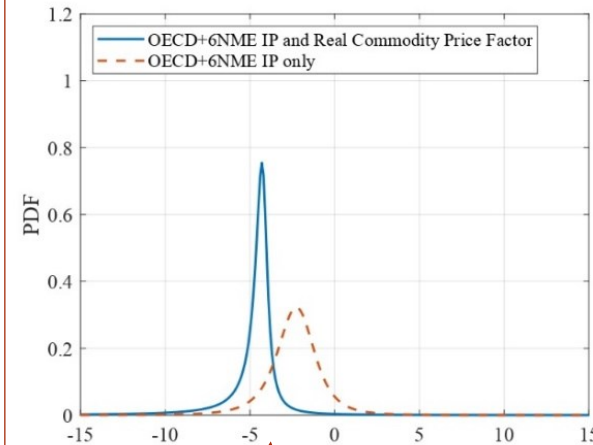


1982 global recession,  $t + 3 =$  March 1981

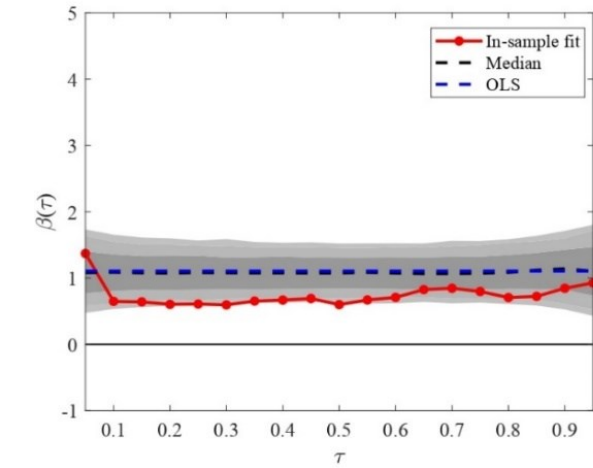


Second sample: one quarter ahead

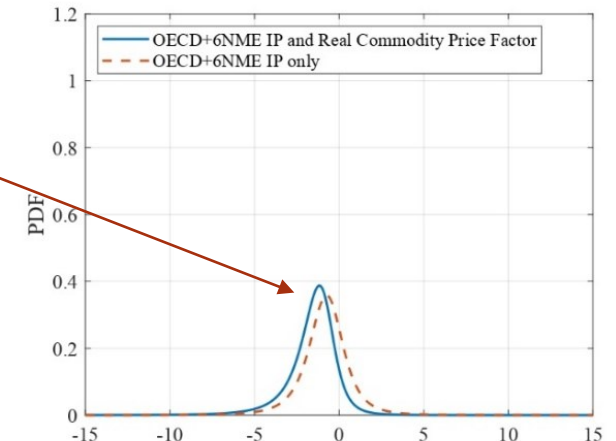
*Great Recession*,  $t + 3 =$  January 2009



Estimated quantile regression coefficients



1982 global recession,  $t + 3 =$  March 1981

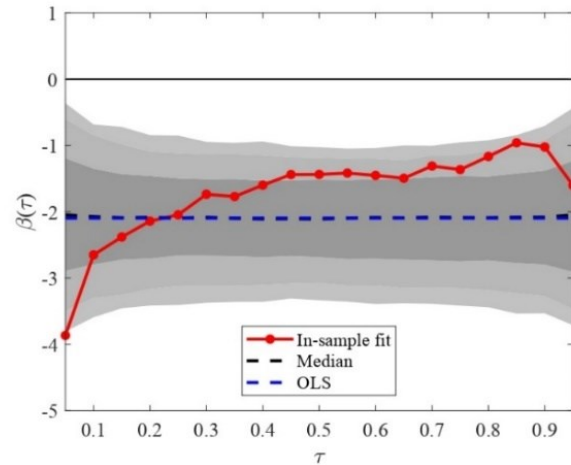


*First moment effect*

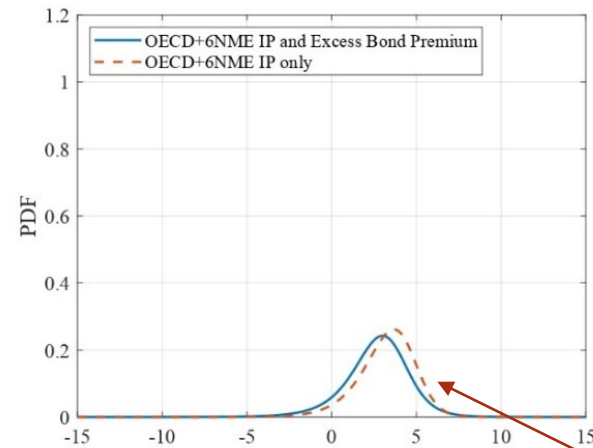
# Excess Bond Premium

First sample: *one year ahead*

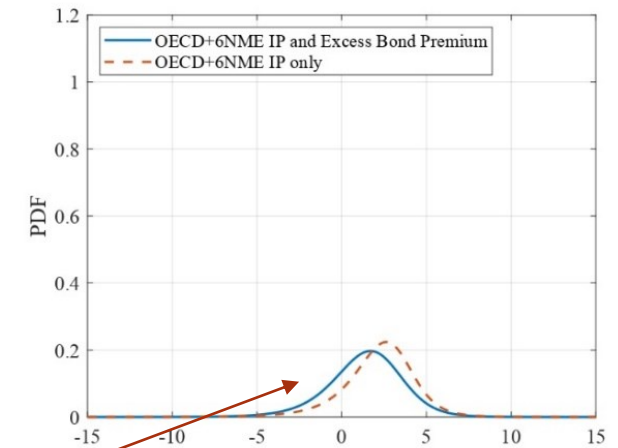
Estimated quantile regression coefficients



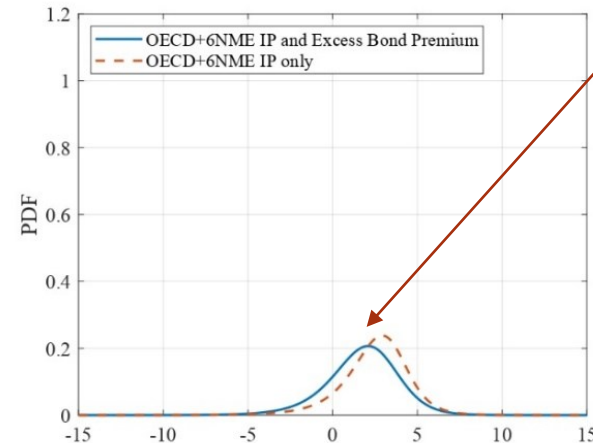
1982 global recession,  $t + 12 =$  March 1981



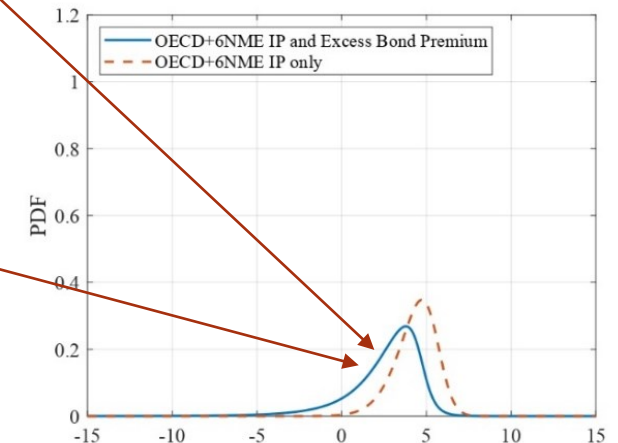
1982 global recession,  $t + 12 =$  October 1982



1991 global recession,  $t + 12 =$  March 1991



Great Recession,  $t + 12 =$  January 2009

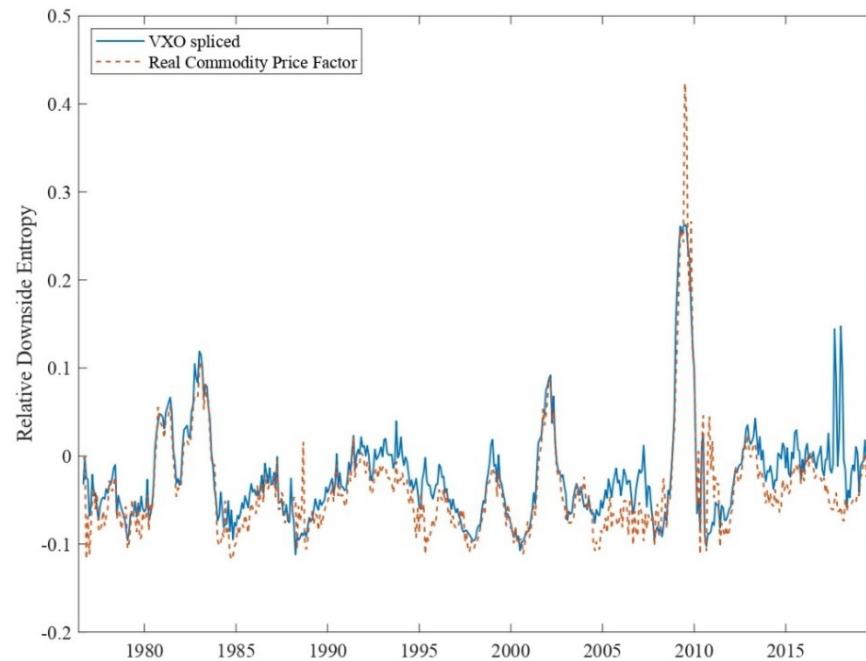


Slightly lower mean  
and higher variance

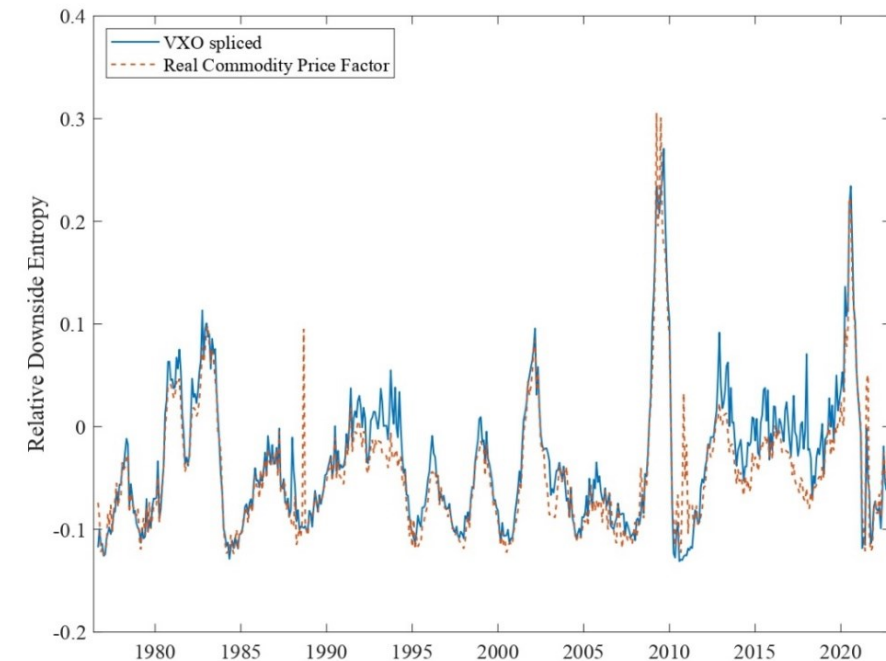
Third moment effect

# RELATIVE DOWNSIDE ENTROPY

First sample: *one quarter ahead*



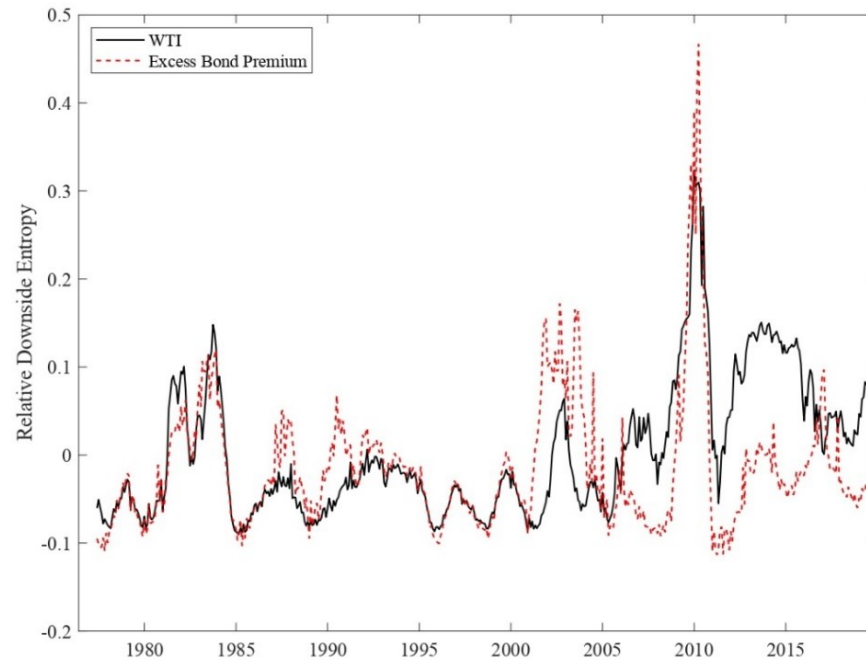
Second sample: *one quarter ahead*



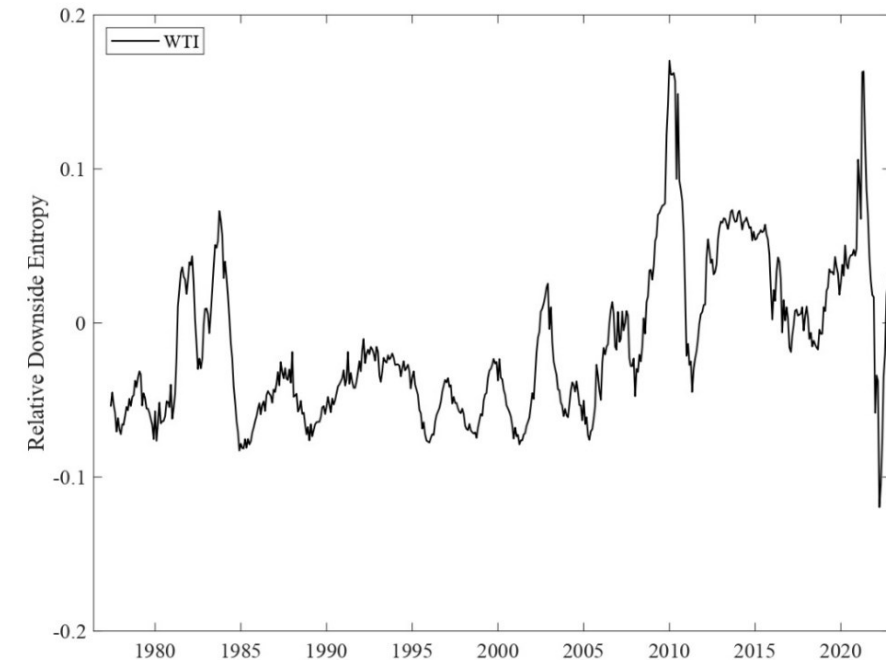
$$L_t^D(\widehat{f_{y_{t+3}|x_t}}; \widehat{g_{y_{t+3}}}) = - \int_{-\infty}^{\widehat{F_{y_{t+3}|x_t}}^{-1}(0.05|x_t)} (\log \widehat{g_{y_{t+3}}}(y) - \log \widehat{f_{y_{t+3}|x_t}}(y|x_t)) \widehat{f_{y_{t+3}|x_t}}(y|x_t) dy$$

# RELATIVE DOWNSIDE ENTROPY

First sample: *one year ahead*



Second sample: *one year ahead*



$$L_t^D(\widehat{f_{y_{t+12}|x_t}}; \widehat{g_{y_{t+12}}}) = - \int_{-\infty}^{\widehat{F_{y_{t+12}|x_t}}^{-1}(0.05|x_t)} (\log \widehat{g_{y_{t+12}}}(y) - \log \widehat{f_{y_{t+12}|x_t}}(y|x_t)) \widehat{f_{y_{t+12}|x_t}}(y|x_t) dy$$

Financial uncertainty



Credit market frictions

Policy implications

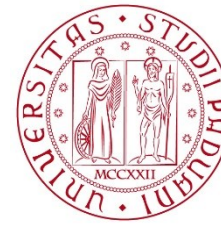
- Monitoring of global financial market developments
- Appropriate regulations to mitigate the recessionary effects of uncertainty shocks

Oil and Commodity prices

Future research...

- ❖ Alternative forecasting approaches
- ❖ Extend the set of predictors
  - global Total Factor Productivity
  - supply chain





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# *What causes global recessions? A quantile regression approach*

**Thank you for your attention**

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*Supervisor: Professor Giovanni Caggiano*

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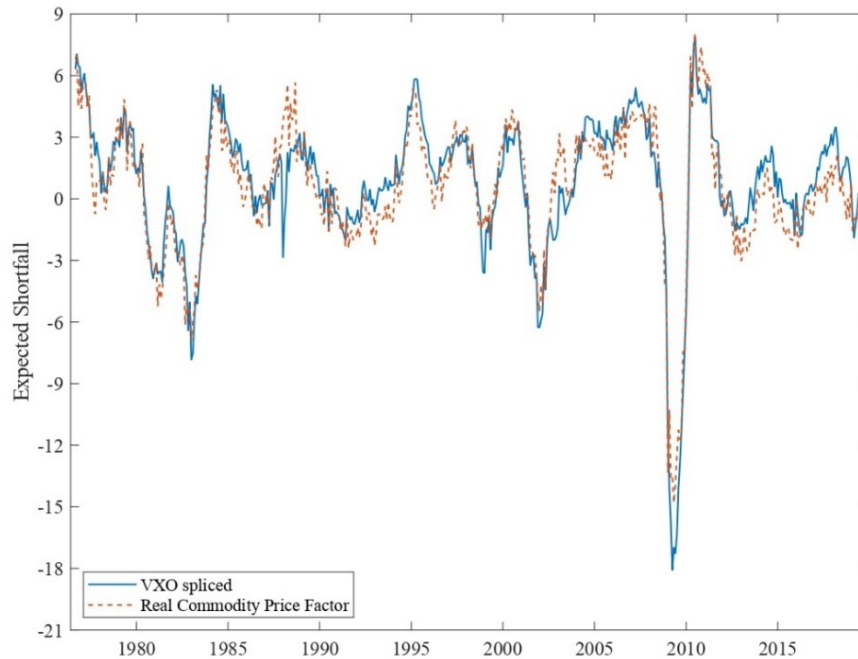
16<sup>th</sup> October 2023



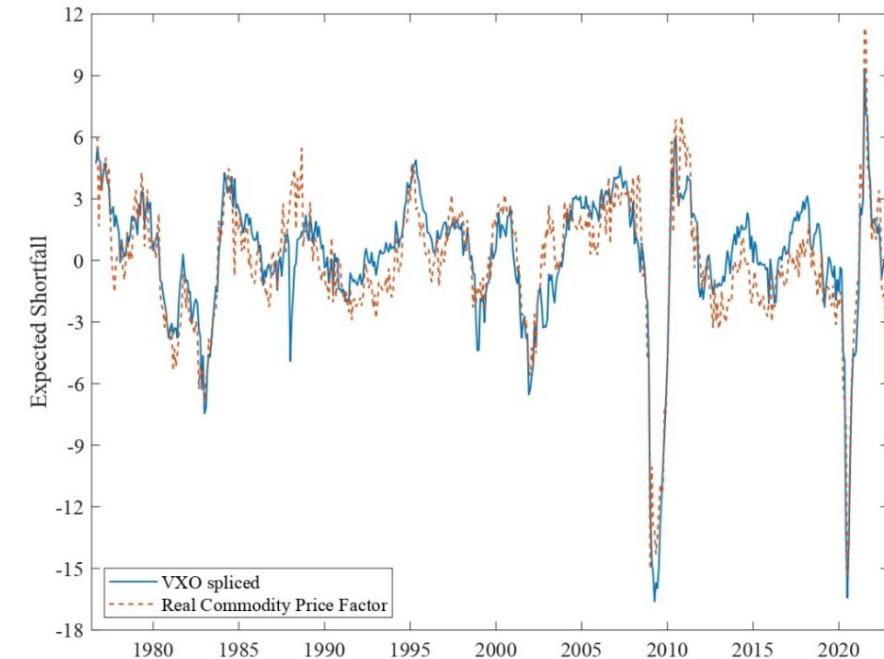


# 5% EXPECTED SHORTFALL

First sample: *one quarter ahead*



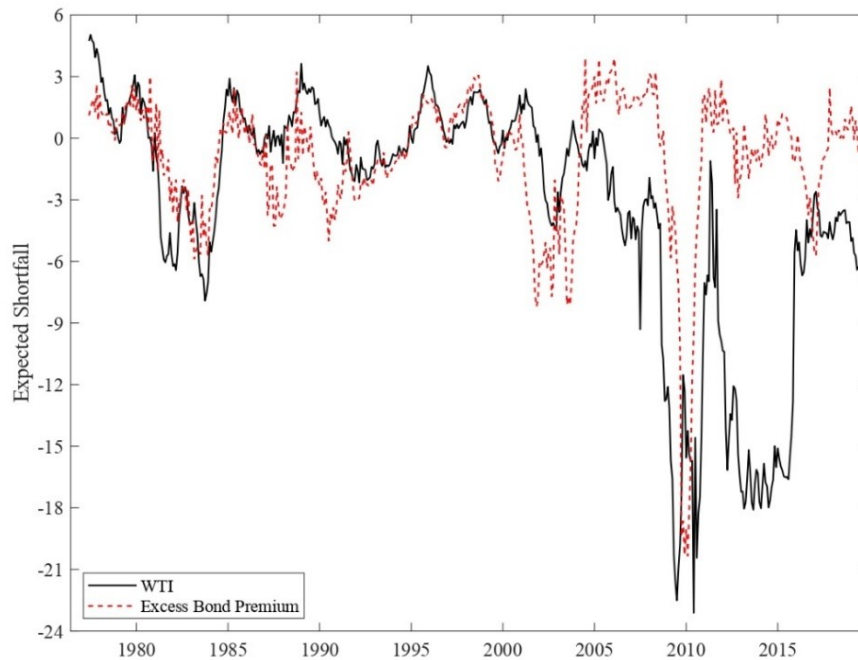
Second sample: *one quarter ahead*



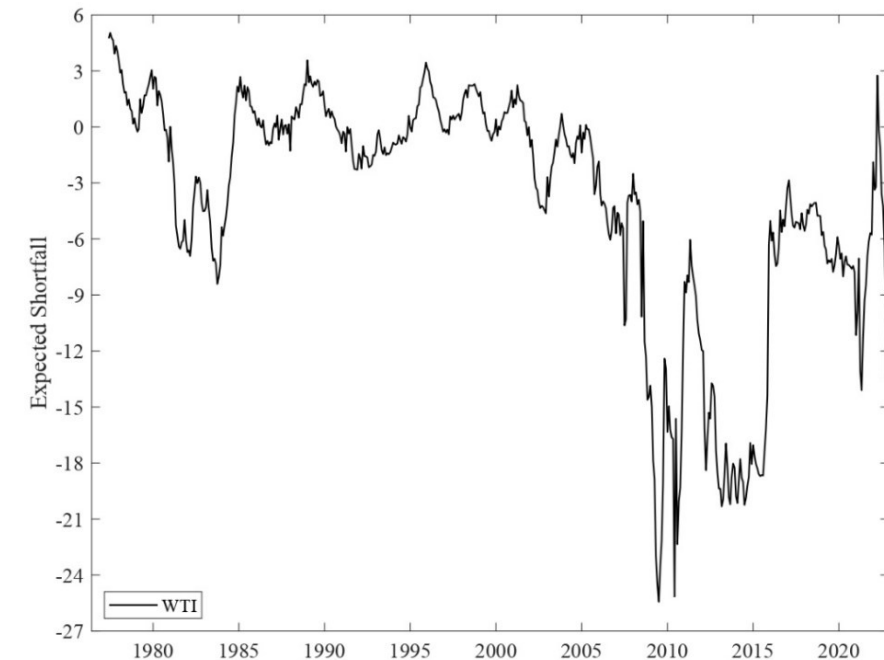
$$SF_{t+3} = \frac{1}{0.05} \int_0^{0.05} \widehat{F_{y_{t+3}|x_t}^{-1}}(\tau|x_t) d\tau$$

# 5% EXPECTED SHORTFALL

First sample: *one year ahead*



Second sample: *one year ahead*



$$SF_{t+12} = \frac{1}{0.05} \int_0^{0.05} \widehat{F_{y_{t+12}|x_t}^{-1}}(\tau|x_t) d\tau$$