Motivation	Data ooo	Heterogeneity 00000	Best Practice	Summary
	How to So	Olve the Price A Meta-Analysis	Puzzle?	
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International Conference on Macroeconomic Analysis and International Finance, 26 May 2011



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How to Solve the Price Puzzle?

Motivation	Data 000	Heterogeneity	Best Practice	Summary 00
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Definition of the Price Puzzle

• The central bank increases the interest rate:

- · Prices should fall.
- \times But a half of all empirical studies show otherwise.
- Price puzzle—the short-run increase in prices after monetary tightening.
- $\rightarrow\,$ Explanation 1: Caused by the cost channel (real increase in prices).
- → Explanation 2: Caused by omitted variables (econometric misspecifications).



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	Fstin	nating the Effec	rts of Moneta	ry Policy

- Workhorse tool: vector autoregression (VAR).
- Results reported graphically \rightarrow impulse response functions.



Motivation	Data	Heterogeneity	Best Practice	Summary
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Meta-Analysis: More than a Literature Survey

Meta-Analysis

We collect available impulse responses and ask:

- What is the average response of prices to monetary tightening?
- 2 Do results systematically depend on the methodology?
- If so, what is the average response implied by best-practice methodology?



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			Data Pr	operties

- We collected published papers using VARs to estimate the effects of a shock to the interest rate on the price level.
- \rightarrow 70 articles contained all necessary information.
 - We use all impulse responses: more than 1,000 estimates collected.
 - Evidence on 31 countries produced by 103 researchers.



Data	Heterogeneity	Best Practice	Summary
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Average Impulse Response: Slow Transmission



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4 Best Practice



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Monetary Transmission Differs Across Countries.



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Monetary Transmission Differs Across Countries.



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Monetary Transmission Differs Across Countries.



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			Country Heter	ogeneity

Why cross-country differences? For example:

- High average inflation → the effect of monetary policy on prices gets weaker (lower credibility).
- 2 High openness → the effect on prices gets stronger (exchange rate channel).
- **3** High central bank independence \rightarrow the effect on prices gets stronger (higher credibility).

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Some methods may cause the price puzzle. Literature suggests:

- 1 Omitted commodity prices (no forward-looking element).
- 2 GDP used instead of output gap (no information about potential output).
- 8 Recursive identification used instead of a structural VAR (consistence with theory).



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What Explains Different Responses?

Meta-regression analysis

- Regress the collected responses (*ê_{ij}*) on method and country characteristics (*X_{kij}*).
- Control for dependence within studies *j* (mixed-effects weighted least squares).
- Correct for publication bias.



It Depends on the Horizon.

Results: short vs. long run

- Method heterogeneity \rightarrow short-run response.
 - Misspecifications contribute to the price puzzle.
- Country heterogeneity \rightarrow long-run response.
 - Signs for country-level variables are consistent with the above-mentioned intuition.



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From the meta-regression:

- Misspecifications systematically influence the results.
- The number of observations and age of data are important.

 \rightarrow Let's use this information to improve our estimate of average impulse response.

• Plug in sample maximums for the number of observations, new data, ..., control for all well-known misspecifications.



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Data	Heterogeneity	Best Practice	Summary
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Best-Practice Impulse Response: Fast Transmission



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			С	onclusion

Main Findings

- The price puzzle in the short run is due to misspecifications.
- 2 The long-run response of prices is driven by country-specific characteristics.
- On average, the transmission of monetary policy shocks seems to be fast.

Project Website

www.meta-analysis.cz/price_puzzle

Motivation	Data 000	Heterogeneity	Best Practice	Summary ⊙●
		Interes	ted in Meta-A	nalvsis?

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- Disdier, A.-C. & K. Head (2008): The Puzzling Persistence of the Distance Effect on Bilateral Trade. The Review of Economics and Statistics 90(1): pp. 37–48.
- Card, D., J. Kluve, & A. Weber (2010): Active Labour Market Policy Evaluations: A Meta-Analysis. *The Economic Journal* **120(548)**: pp. F452–F477.

Reading list on RePEc: ideas.repec.org/k/metaana.html

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