2019 Sloan-Nomis Workshop

# Behavioral Attention Phillips Curve Theory and Evidences from Inflation Survey

 $V\tilde{\textbf{U}}~T.~CH\hat{\textbf{A}}\textbf{U}$  Harvard University

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## **Motivation**

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- The US Phillips Curve  $\pi_t = \beta \widetilde{\mathbb{E}_t} \pi_{t+1} + \kappa x_t$  is unstable:
  - It seems flattened:

 $\kappa_{1980s} >> \kappa_{2000s} >> \kappa_{2010s} \approx 0$ 

- Inflation (expectation) seems well-anchored.
  - Bernanke (2007), Cogley and Sargent (2005), Williams (2006)
  - With  $\widetilde{\mathbb{E}}_t \pi_{t+1} = \pi_{t-1}$ , measure  $\beta_{1980} \approx 1$ , and  $\beta_{1980} \approx 0$ .

# **Flattened Phillips Curve**



Figure: Rolling estimates for K

Note: Estimated equation  $\pi_t = \beta \mathbb{E}^{back} \pi_{t+1} + \kappa x_t + \varepsilon_t$ , with  $\mathbb{E}_t^{Back} \pi_{t+1} \equiv \frac{1}{4} \sum_{h=1}^4 \pi_{t-h}$ ,  $x_t$  is negative CBO unemployment gap. 10-year window (centered from 1960Q1:2018Q1.

### Inflation less persistent



Figure: Rolling estimates for  $\beta$ 

Note: Estimated equation  $\pi_t = \beta \mathbb{E}^{back} \pi_{t+1} + \kappa x_t + \varepsilon_t$ , with  $\mathbb{E}_t^{Back} \pi_{t+1} \equiv \frac{1}{4} \sum_{h=1}^4 \pi_{t-h}$ ,  $x_t$  is negative CBO unemployment gap. 10-year window (centered from 1960Q1:2018Q1.

# **Modeling and Policy concerns**

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• Modeling: missing disinflation puzzle



- Policy questions:  $\kappa\approx 0$  despite QE?
- Similar problem in Europe.

### My paper

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• Provide unified theory for  $(\kappa,\beta)$  behavior based on behavioral inattention.

## My paper

- Provide unified theory for  $(\kappa,\beta)$  behavior based on behavioral inattention.
- Prove and test empirically the Behavioral Attention Phillips Curve (BAPC)

 $\pi_t = \beta_t^d(m)\pi_t^d + \beta_t^f(m)\mathbb{E}_t\pi_{t+1} + \kappa_t(m)x_t$ 

with  $d\beta_t^d/dm < 0$ ,  $d\beta_t^f/dm > 0$ ,  $d\kappa_t/dm > 0$ .

- In early 1980s:  $m \approx 1$ , high  $\beta_t^f$  and  $\kappa_t$ , low  $\beta_t^d$ .
- After 2000s:  $m \approx 0$ , low  $\beta_t^f$  and  $\kappa_t$ , high anchoring  $\beta_t^d$ .
- Empirics: Attention unobserved  $\rightarrow$  use inflation uncertainty from inflation surveys.

## Key assumptions

• Key assumptions:

Firms are behaviorally inattentive to endogenous variables:

$$1-m_t^X\propto rac{1}{\sigma_{X,t}^2}$$

Contemporaneously: X<sub>t</sub><sup>perceive</sup> = m<sub>t</sub><sup>X</sup>X<sub>t</sub> + (1 - m<sub>t</sub><sup>X</sup>)X<sub>t</sub><sup>default</sup>.
 Dynamic: "Behavioral Law of Iterated Expectation"

$$\mathbb{E}_t^{BR}[a_{t+k}] = \mathbb{E}_t[\mathbb{E}_{t+1}^{BR}(a_{t+k})]$$

- Needed only for sticky price analysis, i.e.  $\beta$  analysis.
- Not needed to explain flattened  $\kappa$ .

### Intuition



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# **Baseline Model**

#### • Household:

- consume CES varieties (elasticity  $\varepsilon$ )
- supply labor (Frish elas.  $1/\psi$ )
- hold nominal bonds
- No attention problem.
- Firms:
  - Monopolistic competition
  - DRS technology governed by  $\alpha$ .
- Shocks:
  - Productivity shock: always fully observed.
  - Monetary policy shock (to Taylor rule): AR(1), not necessarily observed.
- Monetary policy: Taylor rule  $i_t = r_t^n + \phi_x x_t + \phi_\pi \pi_t + v$

### **Attention and Price Setting**

- Optimal price for rational agent:  $p_t^*(w_t, a_t, y_t, p_t)$ .
- Firms may (optimally) have wrong estimates  $(y_t^p, \pi_t^p) \rightarrow$  deviate from optimality.
- Attention problem:

$$\min_{m_t^{\pi},m_t^{\times}} \quad -\frac{\Lambda}{2} (\varepsilon^2 (1-m_t^{\pi})^2 \sigma_{\pi,t}^2 + (1-m_t^{\times}) \sigma_{x,t}^2) - \mathcal{C}(m_t^{\pi},m_t^{\times})$$

• With linear cost  $\mathcal{C}(m^{\pi}, m^{y}) = \chi_{\pi} m^{\pi} + \chi_{x} m^{x}$ :

$$1 - m_t^{\pi} = \frac{\chi_{\pi}}{\Lambda \varepsilon^2} \frac{1}{\sigma_{\pi,t}^2}, \quad 1 - m_t^{\chi} = \frac{\chi_{\chi}}{\Lambda} \frac{1}{\sigma_{\chi,t}^2}$$

## **BAPC** without price rigidity

#### Theorem The flexible price BAPC is:

$$\pi_t = \mathbb{E}_{t-1}\pi_t + \kappa_t x_t$$

where the slope  $\kappa_t$  is time-varying and increases with attention:

$$\kappa_t = \frac{\zeta - (1 - m_t^x)}{\varepsilon (1 - m_t^\pi)}$$

for  $\zeta \equiv rac{\sigma(1-\alpha)+\alpha+\phi}{\alpha}$ .

- Back of envelope:  $\alpha = 0.3$ ,  $\sigma = 1$ ,  $\varphi = 0.5$ ,  $\varepsilon = 6$ . Suppose  $m_t^{\pi} = 0$ , then  $m_t^{\chi} \in [0, 1]$  gives  $\kappa \in [0.667, 0.833]$ .
- Conditional on low inflation attention, output attention affects
  κ very little.

### **Equilibrium uniqueness**

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Figure: It is possible for PC to flatten when MP more volatile

### BANKPC

• Now, add price rigidity à la Calvo,  $\theta$ .

Theorem The sticky price BAPC is:

$$\pi_t = \beta_t^d \pi_t^d + \beta_t^f \mathbb{E}_t \pi_{t+1} + \kappa_t x_t$$

with:

$$\begin{split} \beta_t^d &\equiv \frac{\lambda(1-m_t^{\pi})}{1+\lambda(1-m_t^{\pi})} \\ \beta_t^f &\equiv \frac{1}{1+\lambda(1-m_t^{\pi})}\beta \\ \kappa_t &\equiv \frac{m_t^{\chi}}{1+\lambda(1-m_t^{\pi})}\overline{\kappa} \end{split}$$

Rational NKPC nested when  $m_t^x = m_t^\pi = 1$ .

### **Empirics: Flex Price BAPC**

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• Suppose only  $m_t^{\pi}$  and flexible price:

$$\kappa_t = rac{\zeta}{arepsilon(1-m_t^{\pi})} = rac{\zeta arepsilon \Lambda}{\chi_{\pi}} \sigma_{\pi,t}^2$$

with  $\sigma_{\pi,t}^2$  the uncertainty about price inflation.

Thus, specification:

$$\pi_t = \mathbb{E}_{t-1}\pi_t + \left(\kappa_0 + \kappa_1 \sigma_{\pi,t}^2\right) x_t + \varepsilon_t$$

• Want to test null hypothesis  $\kappa_1=0$  vs. alternative hypothesis  $\kappa_1>0.$ 

# **BAPC: Measuring Inflation Uncertainty**

- Michigan Survey of Consumers: household inflation expectation survey since 1946.
- Consistent quarterly survey since 1969.
- 500 1,000 cases per month/quarter.
- Inflation uncertainty = variance of household level forecast:

$$\mu_{\pi,t} \equiv \frac{1}{N} \sum_{i} \mathbb{E}_{t-1}^{(i)} \pi_t$$

$$\sigma_{\pi,t}^2 \equiv \frac{1}{N} \sum_i (\mathbb{E}_{t-1}^{(i)} \pi_t - \mu_{\pi,t})^2$$

- "Disagreement" type measure
- Robust to "subjective uncertainty" type measures.

# **Measuring Inflation Uncertainty**



Figure: Variance of MSC household inflation expectation measures Inflation Uncertainty

- Uncertainty was high in the 70s and early 80s
- But have stabilized since Volcker year.
- 2008 financial crisis tiny uncertainty compared to early years.

### **BAPC:** Estimation

	$\pi_t - \pi_t^e = \alpha + (\kappa_0 + \kappa_1 \sigma_{\pi,t}^2) x_t + (\beta_0 + \beta_1 \sigma_{\pi,t}^2) \pi_{t-1} + \delta \cdot \pi_t^{Oil} + \varepsilon$		
	Traditional PC (1)	Restricted BAPC (2)	Full BAPC (3)
κ <sub>0</sub>	$0.445^{*}$	-0.144	-0.019
	(0.236)	(0.273)	(0.230)
κ1		139.060***	126.679**
		(37.837)	(52.746)
$\beta_0$			$-0.592^{***}$
			(0.155)
$\beta_1$			51.307**
			(20.648)
δ	0.036***	0.036***	$0.034^{***}$
	(0.006)	(0.005)	(0.004)
α	0.052	0.122	1.510***
	(0.280)	(0.260)	(0.400)
RMSE	1.96	1.386	0.981
Ν	192	192	192
$\mathbb{R}^2$	0.516	0.606	0.696
Adjusted $\mathbb{R}^2$	0.511	0.600	0.688
Notae	***Significant at the 1 percent level		

TABLE 1. Estimation Results for Specification (5.2)

Notes:

Significant at the 1 percent level.

\*\*Significant at the 5 percent level.

\*Significant at the 10 percent level.

This table reports estimation result for the Traditional Phillips Curve (Traditional PC), Restricted Uncertainty-Augmented Phillips Curve (Rest, UAPC), and the Full Uncertainty-Augmented Phillips Curve (Full UAPC) using US data from 1970Q1-2018Q2. Heteroskedasticity Autocorrelation Consistent standard errors are reported in parentheses. The RMSE row reports the root mean squared error statistic when specification (5.2) is estimated using data up to 2007Q3 and fitted out-of-sample for data after 2007Q3.

## **BAPC: Implied slope**

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Explain some of the constant-slope estimates of  $\kappa$  to be 0.3-0.5 post-Volcker, and 0.7-0.8 including pre-Volcker. (Lubik and Schorfeide, 2004; Smets and Wouter, 2007)

### BAPC accounts for "missing disinflation"



- · Predicted Inflation (Full UAPC)

• RMSE(BAPC) = 0.981 %, RMSE(Trad. PC) = 1.96%.

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# **Robustness: Other measures of uncertainty**

- MSC variance may measure disagreement, but not subjective uncertainty.
- To measure subjective uncertainty: look to probabilistic survey.
- Survey of Professional Forecasters (SPF) asks forecasters to provide not only point estimates, but a full probability measure on scenario bins.
- "What do you think is the chance of inflation being between 3-3.9%?"

## **GMM** estimation of **BANKPC**

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Use GMM-IV to estimate

$$\pi_t = \beta_t^d \pi_t^d + \beta_t^f \mathbb{E}_t \pi_{t+1} + \kappa_t x_t$$

similar to Gali & Gertler (1999).

• Using same set of instruments, estimate is significant and in line with theory.

# Challenge and future research

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- Identification of attention as the channel.
  - Coibion, Gorodnichenko, Ropele (2018) provides Italian firms evidence.
  - More micro-evidences are welcomed.
- Find cross-country evidence
  - Nominal demand shock more prevalent in many other countries.
  - Europe to control for monetary volatility? (in progress)