Inflation Expectations, Perceptions and News Media: Regional Differences in Switzerland

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Introduction

Inflation and Expectations from Households in Switzerland



- Globally, countries face historically high inflation rates
 - Prevailing challenge for both policy makers as well as households
- Theoretically and empirically, **inflation expectations** are center stage as **main drivers of inflation**
 - Expectations are shaped by information
 - For **households**, **newspapers** are an important source of such information

News Articles about Inflation



Source: Swissdox (2022)

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How does News affect Inflation Expectations and Perceptions?

We proceed in two steps:

- 1. We analyze inflation news reporting in French and German articles
- 2. We study how news reporting affects inflation expectations and perceptions.

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If News Coverage affects Inflation Expectations, real effects can be the consequence:

- Inflation Expectations can be self-fulfilling (Leduc et al., 2007)
- News as a source to (de-)anchor inflation expectations
 - Well-anchored inflation expectations improve the effectiveness of monetary policy (Lamla & Lein, 2014; Nautz & Strohsal, 2015)

- No evidence for negativity bias
- No systematically different news reporting across regions

- Small but significant effects on both expectations and perceptions
- News has stronger effects across older households and households in the German speaking part

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Data

- Swissdox newspaper database
- Selection of the biggest (in terms of readership) newspapers in Switzerland and region
- Focus on printed articles that contain the word inflation (or prices)
- 10,520 newspaper articles in German, 13,407 in French

Classification of Articles

- Common cleaning steps for text (stopwords, punctuation, numbers)
- Sentence-by-sentence analysis of words in the vicinity of inflation
 - count if, within a 5 word distance, a word indicates an increase or decrease
- Constructing a quantitative News Measure: #Increase news - #Decrease News
- Standard measure in the literature
- Prevailing tone of inflation in news

Descriptive Results: Quantitative News Measure



(a) German written Newspapers



Figure 1: Quantitative News Measure (Increase - Decrease)



Newspaper Articles - Qualitative News Measure I

BERT Sentiment Classification

- BERT: Bidirectional Encoder Representation from
 Transformers
- Natural Language Processing (NLP) model by Google AI

Aim: Predict Sentiment of Inflation

- Finetune the language model on this specific task
- 2000 self-annotated articles (positive/negative)
 - Negative: Le matin, 2008-02-2012: [...] The economy does not need it. Inflationary pressures have just returned to a level not seen for more than a decade. [...]
 - Positive: NZZ, 2002-03-22: [...] "The Swiss National Bank (SNB) considers the current interest rate level [...] is appropriate for a sustainable and inflation-free economic development.[...] An increase would be inappropriate in view of the favourable inflation outlook [...]. 11/21

- Machine learning task to identify sentiment of article
- Accuracy: $\sim 75\%$ for both language models
- Human agreement rate for similar classification task around 75 - 85% (Shalunts et al., 2016)

Newspaper Articles - Qualitative News Measure: Results



(a) Sentiment: German



(b) Sentiment: French

QvsS

Media Reporting

To analyse newspaper reporting of the quantitative and qualitative measure, we use a **threshold SVAR**

- We follow Gambetti et al. (2021) to study newspaper reporting when inflation is increasing versus decreasing
- $y_t = [\Delta \pi_t, \operatorname{news}_{t,r}]'$ with $r \in (DE, FR)$
- Goal: Study the reaction of the news measure in newspapers to an increase or decrease in inflation
- Analyse impulse response functions to an innovation in the inflation rate change which is orthogonal to the remaining shocks in the system



Results

Results

Quantitative Measure

- No negativity bias
- No systematic differences across newspapers

Qualitative Measure

- No difference for French written newspapers QDE
- No difference for German written newspapers QFR
- No significant differences across newspapers ALR
- $\rightarrow\,$ No systematic bias in newspaper reporting within and across regions

Effect of media shocks and Inflation Expectations and Perceptions

- Quarterly national survey that covers questions about inflation expectations and perceptions, including data about the region
 - How, in your view, have (will) prices changed (change) over the last (next) 12 months? Have (will) they: risen (rise) sharply; risen (rise) slightly; remained (remain) virtually unchanged; fallen (fall) slightly, fallen (fall) strongly

Media shock and Inflation Expectations - Model

- We use the orthogonalized media-shocks from the first TSVAR model, aggregated on quarterly frequency
- This shock is **unrelated** to changes in the current and past inflation rate, but **triggers** a change in the news measure
- Dependant variable: binary indicator, decrease (=0) versus increase (=1) in inflation expectations and perceptions
- QMS: Quantitative Media Shock, SMS: Sentiment Media Shock
- Linear probability model
- Controls: age, male/female, time fixed-effects, region

 $\mathsf{reply}_{i,r,t,q} = \alpha + \sum_{j=1}^{2} \beta_j \mathsf{QMS}_{r,t+1-j} + \sum_{j=1}^{2} \tilde{\beta}_j \mathsf{SMS}_{r,t+1-j} + \phi \mathsf{HH}_{i,r,t} + \mu \mathsf{Region}_r + \gamma_t + \varepsilon_{i,r,t}$

Results

$\mathsf{reply}_{i,r,t,q} = \alpha + \sum_{j=1}^{2} \beta_j \mathsf{QMS}_{r,t+1-j} + \sum_{j=1}^{2} \tilde{\beta}_j \mathsf{SMS}_{r,t+1-j} + \phi \mathsf{HH}_{i,r,t} + \mu \mathsf{Region}_r + \gamma_t + \varepsilon_{i,r,t}$

	(1)	(2)
	reply _e	replyp
Quantitative Media Shock _t	1.34**	0.85
	(0.62)	(0.95)
Quantitative Media $Shock_{t-1}$	0.24	0.47
	(0.68)	(0.90)
Qualitative Media Shock _t	0.19	1.08**
	(0.48)	(0.48)
Qualitative Media Shock $_{t-1}$	0.08	0.36
	(0.49)	(0.49)
Date FE	Yes	Yes
Region _{i.t}	Yes	Yes
HH _{i,t}	Yes	Yes
Observations	32,447	34,747
\overline{y}	85	86

Note:* p<0.10, ** p<0.05, *** p<0.010. Standard Errors are clustered at the18/21 date \times region level.

	$\Delta\pi>0$		$\Delta\pi\leq 0$	
	(1) reply _e	(2) reply _p	(3) reply _e	(4) reply _p
Quantitative Media Shock _t	1.41**	1.64	1.17	0.38
	(0.69)	(1.41)	(1.05)	(1.10)
Quantitative Media Shock $t-1$	1.36*	2.36**	-2.11	-0.41
	(0.70)	(1.01)	(1.40)	(0.58)
Qualitative Media Shock _t	-0.87**	-0.14	1.71	3.30***
	(0.36)	(0.44)	(1.10)	(0.77)
Qualitative Media $Shock_{t-1}$	0.10	0.42	-0.79	0.03
	(0.50)	(0.60)	(1.33)	(1.01)
Date FE	Yes	Yes	Yes	Yes
Region _{i,t}	Yes	Yes	Yes	Yes
HH _{i,t}	Yes	Yes	Yes	Yes
Observations	17,379	18,545	15,064	16,200
\overline{y}	89	89	81	83

Note:* p<0.10, ** p<0.05, *** p<0.010. Standard Errors are clustered at the date \times region level. 19

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Age Groups:

- Expectations:
 - Higher Effect among elderly households Age
- Perceptions:
 - Positive, but not significant effect among elderly househlds

Region:

 Significantly lower effect for households in the French speaking region

Conclusion

Policy implications

- Effects of news: identification via language border
 - Small but significant effects on expectations and perceptions
- Real effects can be the consequence
 - Inflation expectations can be self-fulfilling
- As communication of central banks is picked-up by news media (20% of articles), their message is transmitted to households
 - anchoring inflation expectations through inflation sentiment
 - well-anchored inflation expectations improve the effectiveness of monetary policy
- Qualitative inflation sentiment can be used as a timely policy indicator how newspapers assess inflation

Thank you for your attention
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Appendix

Media reporting and negativity bias

- Economic outcomes: unemployment (Gambetti et al, 2021; Soroka, 2006), inflation (Soroka, 2006)
 - Inflation increase (decrease) regarded as bad (good) news
- $\rightarrow\,$ We investigate inflation news reporting using a TSVAR

The role of information for expectations and perceptions

- Manklw et al. (2003), Colben & Gorodnichenko (2015), Bordalo et al. (2020), Cavallo et al. (2017)
- → We exploit the language barrier in Switzerland to study the effects of news on expectations and perceptions

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- \rightarrow Different effect of news across language border

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- Inclusion of Business Cycle Indicator
- Inclusion of Growth Rate of Stock Prices
- Quantification of Inflation Expectations QEX
- Cantonal Inflation Rates CIF
- Index conditional on newspaper INP-DE INP-FR

Descriptive Results - I: Inflation Increase News



Figure 3: Increase News

Descriptive Results - II: Inflation Decrease News



Figure 4: Decrease News



Newspaper Articles - Qualitative vs. Quantitative Measure



Figure 5: Sentiment: German

 TA, 2015-04-30: [...] The US FED and Swiss National Bank have quintupled their balance sheets since the crisis, the ECB has doubled and central bankers are not afraid of inflation but of deflation. [...]

Back

 Le Temps, 2015-08-22: [...] Switzerland confronted with high risk of deflation [...] 31/21

Cantonal Inflation Rates



Figure 6: Cantonal Inflation Rates

Inflation Rates FR versus DE



Figure 7: Inflation Rates for Germany and France

TSVAR: German Newspapers and Sentiment



Figure 8: TSVAR: German



TSVAR: French Newspapers and Sentiment



Figure 9: TSVAR: French



Quantitative Measure by Newspaper - German Newspapers



Figure 10: Index by Newspaper - German



Differences Across Regions - I



Figure 11: Differences in Quantitative News Measure Across Region

Differences Across Regions - II



Figure 12: Differences in Qualitative News Measure Across Region



Figure 13: Index by Newspaper - French

Different Effects Across Regions

	(1) reply _e	(2) reply _p
German speaking Region		
Quantitative Media Shock _t	1.35*	1.06
	(0.69)	(1.04)
Quantitative Media $Shock_{t-1}$	0.69	1.36
	(0.65)	(0.82)
Qualitative Media Shock _t	1.25*	1.14**
	(0.74)	(0.53)
Qualitative Media $Shock_{t-1}$	-0.41	-0.56
	(0.71)	(0.67)
French speaking Region		
French speaking Region=1 \times Quantitative Media Shock_t	-0.30	-1.20**
	(0.51)	(0.47)
French speaking Region=1 \times Quantitative Media $Shock_{t-1}$	-1.50***	-1.86***
	(0.55)	(0.58)
French speaking Region=1 \times Qualitative Media $Shock_t$	-2.40**	-0.52
	(1.10)	(0.90)
French speaking Region=1 \times Qualitative Media Shock_{t-1}	0.55	-0.90
	(1.17)	(0.83)
Date FE	Yes	Yes
Region _r	Yes	Yes
Back	Yes	Yes
Observations	32,447	34,747
$ar{y}$	85	86 40/21

Different Effects across Age



(a) Expectations



(b) Perceptions

Quick Summary

Assumptions

- Survey Participants form their E based on subjective probability distribution (pd)
- The individual pd can be aggregated to a joint pd $f(x_{t+4|\Omega_t})$ with $\mathbb{E}[x_{t+4}|\Omega_t] = \mu_{t,t+4}$
- We assume a normal distribution function
- There exists an interval $-\delta^L_{it}, \delta^U_{it}$, in between households report "constant prices"
- There exists a threshold λ_t where households report "prices increase strongly"



$$P(x_{t+4} \le -\delta_t^L) = F(-\delta_t^L) = A_t$$



 $P(\delta_t^L < x_{t+4} \le \delta_t) = F(\delta_t) - F(-\delta_t^L) = B_t$



$$b_t = F^{-1}(A_t + B_t) = \frac{\delta_t - \mu_{t+4}}{\sigma_{t+4}}$$

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$$\mu_{t+4} = \frac{\lambda_t(a_t + b_t)}{(a_t + b_t - 2c_t)}$$
$$\sigma_{t+4} = \frac{-2\lambda_t}{(a_t + b_t - 2c_t)}$$
$$\delta_t = \frac{\lambda_t(a_t - b_t)}{(a_t + b_t - 2c_t)}$$

- 4 unknowns, 3 equations.
- Estimation of λ_t may follow different approaches (Rosenblatt-Wisch and Scheufele, 2015)
- We focus on a state-space model with time-varying parameters
- We provide robustness checks using rolling regressions

To estimate $\lambda_{t},$ we use the information from the perceived inflation rate

Assumption

- On average, households perceive inflation to be equal to actual inflation $\hat{\pi_t}=\pi_t$
- Allows to estimate λ_t using a Kalman Filter set-up

$$\hat{\pi}_t = \frac{\lambda_t (a'_t + b'_t)}{(a'_t + b'_t - 2c'_t)}$$

where a'_t , b'_t and c'_t are the quantiles of the standard normal distribution calculated from the answers about **perceived inflation**

• On average, $\hat{\pi}_t = \pi_t$. Therefore, λ_t can be estimated as

$$\pi_t = \lambda_t \frac{(a'_t + b'_t)}{(a'_t + b'_t - 2c'_t)} + u_t$$
$$\lambda_t = \lambda_{t-1} + v_t$$

with $\mathbb{V}ar(u_t) = (1 - \gamma)\sigma^2$ and $\mathbb{V}ar(v_t) = \gamma\sigma^2$. For initial estimates of the variance parameters σ^2 and γ , we follow Cooley (1976) using a constrained maximum likelihood function. 45/21



Figure 15: Expectations conditional on the Region
Effects on Quantified Inflation Expectations

	Baseline	$\Delta \pi > 0$	$\Delta\pi\leq 0$	Region
	(1)	(2)	(3)	(4)
	$\mathbb{E}[\pi_{t+4}]$	$\mathbb{E}[\pi_{t+4}]$	$\mathbb{E}[\pi_{t+4}]$	$\mathbb{E}[\pi_{t+4}]$
Quantitative Media Shock _t	0.04	0.01	-0.00	0.02
	(0.25)	(0.03)	(0.04)	(0.03)
Quantitative Media Shock _{t-1}	-0.02	0.01	0.01	0.02
	(0.03)	(0.04)	(0.04)	(0.03)
Qualitative Media Shock _t	0.02	0.02	0.03	0.02
	(0.02)	(0.02)	(0.04)	(0.03)
Qualitative Media $Shock_{t-1}$	0.02	0.01	0.07*	0.03
	(0.02)	(0.02)	(0.04)	(0.03)
French speaking Region=1 \times Quantitative Media $Shock_t$				-0.04*
				(0.02)
French speaking Region=1 \times Quantitative Media $Shock_{t-1}$				-0.04
				(0.03)
French speaking Region=1 $ imes$ Qualitative Media Shock $_t$				-0.02
				(0.04)
French speaking Region=1 \times Qualitative Media Shock_{t-1}				0.01
				(0.05)
Date FE	Yes	Yes	Yes	Yes
Observations	154	80	74	154
Σ _y	0.61	0.65	0.57	0.61



Quantitative Measure: Differences for German newspapers II



Figure 16: Results TSVAR for Quantitative Measure in German Newspapers



Quantitative Measure: Differences for French newspapers



Figure 17: Results TSVAR for Quantitative Measure in French Newspapers



Details TSVAR

- We follow Gambetti et al. (2021) to study newspaper reporting when inflation is increasing versus decreasing
 - Allows to control for the persistence of the shocks of inflation
- $y_t = [\Delta \pi_t, \operatorname{news}_{t,r}]'$ with $r \in (DE, FR)$
- Aim: Analyse whether newspapers report differently in times when inflation is increasing or decreasing

$$y_t = (1 - \Gamma(z_t))[y_{t-1}\beta_1] + \Gamma(z_t)[y_{t-1}\beta_2] + \varepsilon_t$$
(1)

- $\varepsilon_t \sim WN(0, \Sigma)$
- $\Gamma(z_t)$ is a function that takes the value 1 or 0, $z_t = \Delta \pi_{t-1}$
- $\Gamma(z_t) = 0$ if $\Delta \pi_{t-1} \leq 0$ and $\Gamma(z_t) = 1$ if $\Delta \pi_{t-1} > 0$
- Estimated by OLS on two subsamples for each region

Inflation Reporting in Newspapers - Model

- We study the reaction of the news measure in newspapers to an increase or decrease in inflation
- We analyze impulse response functions to an innovation in the inflation rate change which is orthogonal to the remaining shocks in the system
- $\rightarrow\,$ Colesky decomposition
 - $SS' = \Sigma$, $v_t = S^{-1}\varepsilon_t$
 - v_{1t} is the innovation in the inflation rate change which is orthogonal to v_{2t}
 - It captures any factor that changes the inflation rate unexpectedly
 - No Structural Shock

Quantitative Measure: Differences for German newspapers



Figure 18: Results TSVAR for Quantitative Measure in German Newspapers

