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## **Business Cycle Dynamics and Firm Heterogeneity** *Evidence for Austria*

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Business cycle analysis usually focuses on the macro level.

 Microdata at the firm level can contribute to a better understanding of the behaviour of aggregates (Higson et al., 2002; Basile et al., 2014) or even help to produce better forecasts (Strasser and Wohlrabe 2016)

-> role of firm heterogeneity

 Shocks specific to industries/regions may also influence aggregate outcomes and impact the business cycle (Granularity hypothesis of Gabaix 2011)

-> role of industry/regional heterogeneity



- BTS data is usually studied with regard to the aggregate consistency of the business tendency survey responses over time (business cycle dimension)
- Our research objectives
  - We are interested in micro-consistency i.e. whether lagged variables contain useful information at the firm level
  - Take (observable) heterogeneity into account in modelling business cycle dynamics; i.e. adding firm-level, industry-/regional-specifics -> is there a role for structural/regional dimensions?
  - NEW! Is there a relationship between the size of the "explained" component and uncertainty or the state of the business cycle?



- Business tendency survey (WIFO Konjunkturtest) data-> firm-level
  - Manufacturing industry, 2772 firms
  - Time period 1996 to 2012
  - Around 55.000 quaterly observations
- Employment data (Austrian social security database)-> industry-/regional-level
  - (break of time series prevents use of industrial statistics)
  - Sectoral (NACE-3-digit) break-down
  - Regional (NUTS-3-level) break-down
  - Monthly observations



### Firm-level (business cycle dimension)

Owertige	Economic	<b>()</b>	exp. Effect /
Question	Process <sup>1)</sup>	Timing <sup>2)</sup>	Correl. <sup>3)</sup>
Production (change), next 3 months	Expectations	lead	+
Selling prices (change), next 3 months	Expectations	lead	+
Firm's employment (change), next months	Expectations	lead	+
Firm's business sentiment (level), next 6 months	Sentiment	lead	+
Total order books (level), current	Demand	lead	+
Factors limiting productions <sup>4)</sup>	Demand/Supply/Finance	lead/co	-
Stocks of finished products (level), current	Demand/Production	со	-
Selling prices (change), past 3 months	Demand/Production	со	+
Capacity utilisation (level)	Production	со	+

Notes: 1) Classification according to Oppenländer (1996, p. 27). 2) The timing notation indicates the expected temporal pattern with respect to the current production activity of a firm: lead=leading; co=contemporaneously. 3) The "+" and "-" sign indicates the expected change of current production output based on an increase of the respective survey indicator. Its also an indication of the pro-/countercyclicality of the indicator. 4) We test for two (out of six) categories: insufficient demand and financial constraints.

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## Structural dimension

- Firm-level
  - Firm size and industry affiliation
- Industry-specific indicators (time averages)
  - Excess labour turnover as proxy for mobility barriers/sunk costs
  - Avg. Employment growth and No. of employees
- Regional-specific indicators
  - Sector concentration (related variety; Frenken et al., 2012)
  - Employment concentration (Herfindahl type index)
  - Local externalities (aggregate output in region x employment density; Basile et al., 2014)



### Proxy for the 'aggregated' business cycle

 Question on "Our production has been ... in the last 3 months? (a) increased, (b) remained the same, or (c) decreased"

### ordered probit model

- Correlated random effects (Wooldridge, 2002)
- Maximum likelihood estimation
- Assuming same thresholds across individuals (strong assumption)
- Interested in marginal effects



Step 1: Proxy for the 'aggregated' business cycle

• Model 
$$y_{it}^* = \eta_t + c_i + u_{it}$$
,

with  $i = 1, \dots, N$ ;  $t = 1, \dots, T$ 

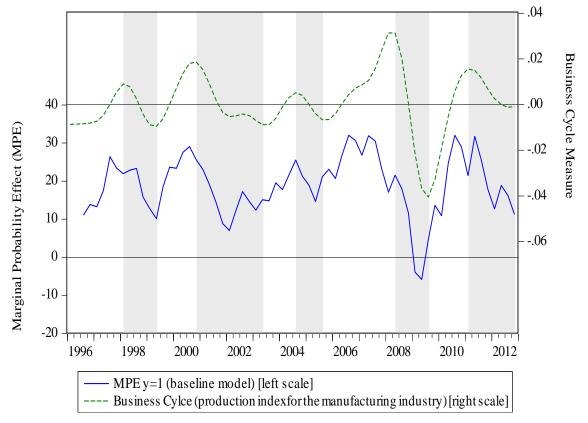
*Figure B1: Marginal probability effects of time-dummies*  $(y_{it} \in \{1,2,3\})$ 

40 40 30 30 **Positive answers** Marginal Probability Effect (MPE) Marginal Probability Effect (MPE) 20 20 10-10 0 -10--20 -10 Negative answers 1996 1998 2006 2008 2010 2012 2000 2002 2004 -20 -1998 2004 2006 2008 2010 2012 1996 2000 2002 MPEy=1 (baseline model) MPEy=2 (baseline model) Confidence interval MPEy=3 (baseline model) MPE y=1 (baseline model) 7 Q: 15.11.2016 Confidence interval



 Correlation of the marginal effects (positive answers) with the business cycle component of IP: 0.72

• Model 
$$y_{it}^* = \eta_t + c_i + u_{it}$$
, with  $i = 1, ..., N$ ;  $t = 1, ..., T$ 





## **Full estimation results**

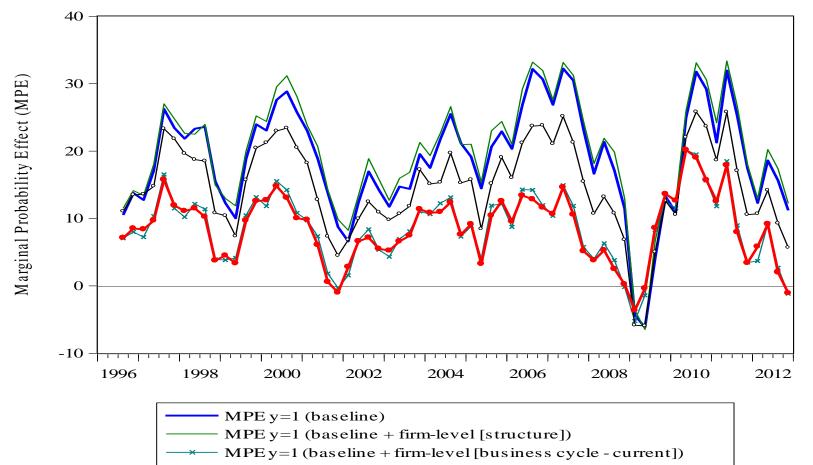
Fi	ndings (mpe of y=1)	Short- run respor shock Firm-	level	erages – long run level effect
ſ	Order books <sub>t-1</sub>	+0.12	+0.49	
	Insufficient demand	-0.15	n.sig.	
current	Stock of finished products	-0.10	+0.13	
cn	Selling prices	+0.10	n.sig.	
	Capacity utilisation	+ 0.01	-0.01	firr
expectations	Production <sub>t-1</sub>	+0.22	+0.05	firm-level
	Selling prices <sub>t-1</sub>	-0.03	n.sig.	<u>e</u>
	Employment <sub>t-1</sub>	+0.06	n.sig.	
	Business sentiment <sub>t-1</sub>	+0.05	n.sig.	
structure	<ul> <li>Firm size</li> </ul>	-0.05	+0.05	
	Industry	[n.]sig.	[n.]sig.	
	Regional	n.sig.	n.sig.	

15.11.2016

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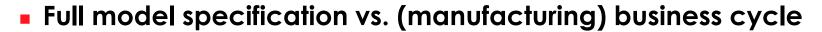
### Explanatory power of the firm-level covariates

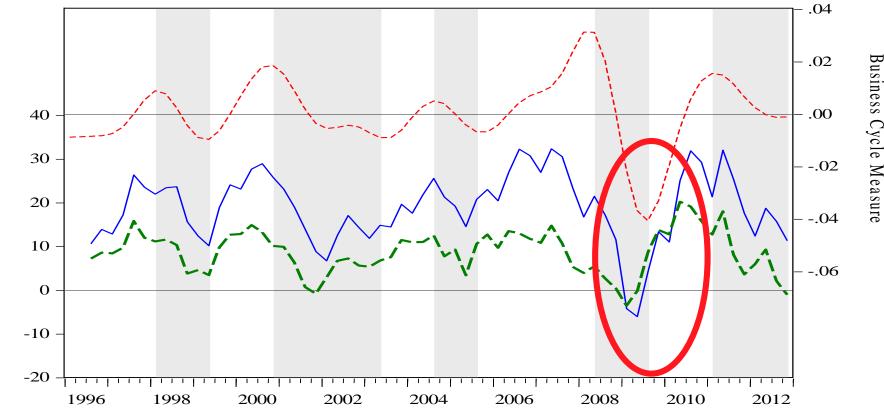


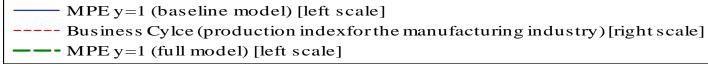


→ MPE y=1 (baseline + firm-level [full])





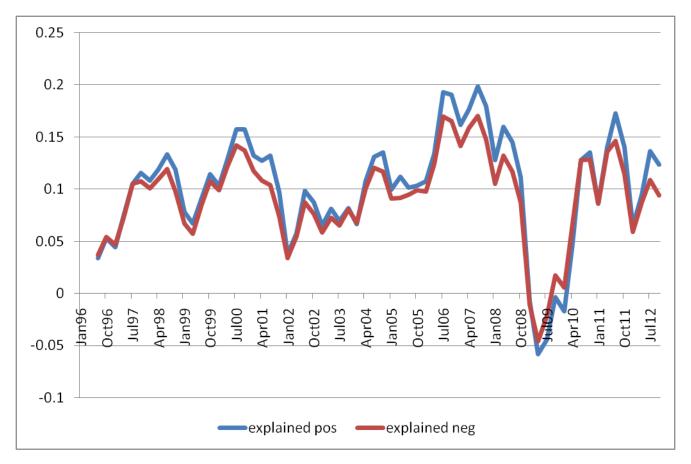




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# WIFO EXPlained by the covariates other than the fixed effects

### Difference between fixed effects of the baseline and the full model



## **WIFO** Role of uncertainty and business cycle

## We measure uncertainty I using production expectations (Bachmann)

 $\sqrt{\text{%age POS}_t + \text{%age NEG}_t - (\text{%age POS}_t - \text{%age NEG}_t)^2}$ 

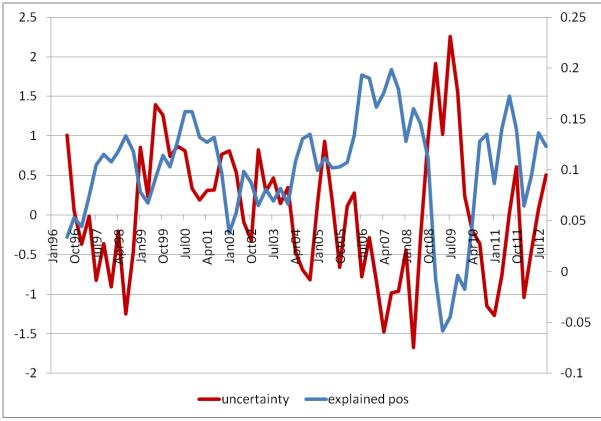
## Cross-sectional Standard deviation – uncertainty as disagreement

Uncertainty II – score from WIFO question: on "how certain/uncertain" respondents assess their own expectations

# Business cycle: business cycle component of industrial production 13

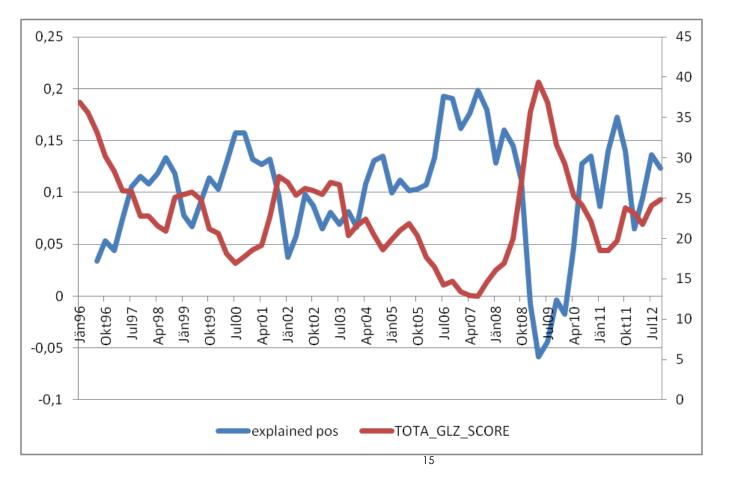


- Correlation: -0.53
- Higher uncertainty covariates explains less
- Unexpected changes in sentiment?



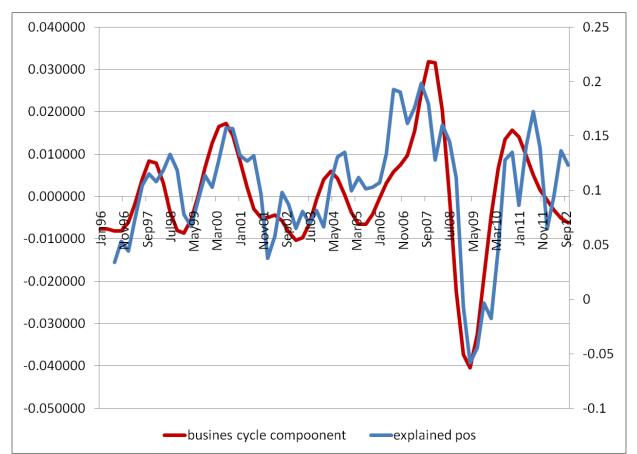
## WIFO Uncertainty II: direct survey measure

- Correlation: -0.87
- Higher uncertainty covariates explains less





- Correlation: +0.83
- Downturns covariates explains less.
- Good weather model? Are downturns unexpected/uncertain?





- We find consistency of current assessments and expectations over time within the BTS:
  - The behaviour of the marginal effects follows closely the business cycle component of industrial production in Austria.
  - Current covariates are informative. From the covariates related to the assessment of the current situation, order books (t-1), demand conditions and capacity utilisation show the highest explanatory power.
  - Expectations are informative. From the covariates related to expectations (the coming months) production expectations (t-1) exhibits the greatest effect.
- With respect to structural characteristics
  - we find a (weak) negative ('left over') effect for firm-size,
  - no effect for industry affiliation but some evidence for industrycharacteristics (e.g. excess labour turnover);
  - regional aspects do not play a role in Austria





- Is there a relationship between the size of the "explained" component and uncertainty or the state of the business cycle?
  - Yes, the covariates have more explanatory power during upturns than during downturns and when uncertainty is low.
  - Further research: disentangeling uncertainty and the state of the business cycle.



# Thank you for your attention.

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