



## Synchronization or Asymmetry of Business Cycles at EU NUTS 3 level

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Workshop “The Impact of Economic Integration on Regional Business Cycles Synchronization”

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Motivation &  
Research Question

Data & empirical approach

Preliminary results & further steps



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# WHY?



- Comovement in a sectoral business cycle can happen due to common shocks or to vertical linkages (Duval et al, 2014; Shea, 2002).
- Some literature do not capture the trade co-movement relationship, thus this can be addressed by exploring more granular data such as sectoral data at EU NUTS 3 scale.
- Interestingly, NUTS 2, NUTS 3 levels allow to look at one country regions as well as at many countries various regions. Also, we can look at different sectors BC patterns in the same region. Do regions converge? Do sectors in regions converge? What are the factors, having in mind that this could be the same country and the same NUTS 2 region for NUTS 3 regions.
- In the setting of one country we have the same currency, same fiscal policy, free trade and free labour migration. Transmission of shocks from sector to sector or from region to region? Controlling for region, country & global factors, spatial or other factors?
- Aim is to contribute by applying the analyses of regional sectors BC co-movement to the EU at NUTS3 scale. Identification of the channels for shock transmission can provide adequate policy responses. This work will contribute to the literature by exploring linkages in BC comovement for GVA PPS and employment at EU NUTS3 scale.

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## RELATED LITERATURE



- **Business cycle synchronization, sectoral comovement.**  
Abiad et al (2013); Duval et al. (2014); Shea (2002)
- **Regional Economic Integration.**  
Bierbaumer-Polly, Huber & Rozmahel (2016), Bandres et al (2017), Cainelli et al. (2021)

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## DATA



- NUTS 3 level (~ 1800), 5 main sectors: **A** - Agriculture, Forestry and Fishing, **BE** – Industry, **F** – Construction, **GJ** - Wholesale, Retail, Transport, Accommodation & Food Services, Information and Communication, **KN** - Financial & Business Services
- Period: 1980 – 2018 (old EU countries), 1990/1995 – 2018 (new EU countries); frequency – year
- Variables: employment, GVA PPS

# NUTS (Nomenclature of territorial units for statistics)



## Criteria:

- a) Administrative unit,
- b) the average size of this class of administrative units in the Member State shall lie within the population thresholds (see above),
- c) the population of a territorial unit shall consist of those persons who have their usual place of residence in this area.

Level	Minimum	Maximum
NUTS 1	3 million	7 million
NUTS 2	800 000	3 million
NUTS 3	150 000	800 000

## Codes & names of NUTS3 regions of the Baltic States



EE001	<u>Põhja-Eesti</u>	LT011	<u>Vilniaus apskritis</u>
EE004	<u>Lääne-Eesti</u>	LT021	<u>Alytaus apskritis</u>
EE006	<u>Kesk-Eesti</u>	LT022	<u>Kauno apskritis</u>
EE007	<u>Kirde-Eesti</u>	LT023	<u>Klaipėdos apskritis</u>
EE008	<u>Lõuna-Eesti</u>	LT024	<u>Marijampolės apskritis</u>
LV003	<u>Kurzeme</u>	LT025	<u>Panevezio apskritis</u>
LV005	<u>Latgale</u>	LT026	<u>Siauliu apskritis</u>
LV006	Rīga	LT027	<u>Tauragės apskritis</u>
LV007	<u>Pierīga</u>	LT028	<u>Telsiu apskritis</u>
LV008	<u>Vidzeme</u>	LT029	<u>Utenos apskritis</u>
LV009	<u>Zemgale</u>		

## EMPIRICAL APPROACH



➤ **Coefficient of variance:**

$$CV = \frac{\sigma_{kt}}{g_{kt}}$$

➤ **BC synchronization:**

- correlation of time series: In GVA PPS filtered by HP,  $\lambda = 6.25$
- quasi correlation: first difference of In GVA pps/employment in region  $i$  of industry  $k$  in time  $t$ .

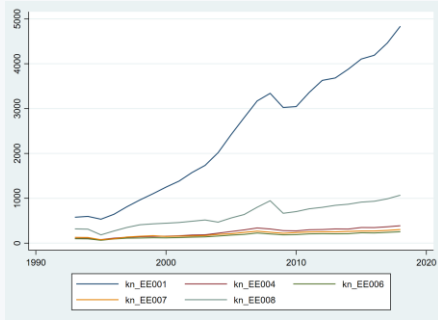
$$QCorr_{ijt} = \frac{(g_{ikt} - g_{ik}^*) * (g_{jkt} - g_{jk}^*)}{\sigma_{ik}^g * \sigma_{jk}^g}$$

Where  $QCorr_{ijt}$  – quasi correlation of GVA growth rates of regions  $i$  &  $j$  of  $k$  industry,  $g_{it}$  – output growth rate of region  $i$  in year  $t$ ,  $g_i^*$  and  $\sigma_i^g$  denotes the mean and standard deviation of output growth rate of region  $i$  of industry  $k$  in sample period. The growth rate is measured as the first difference of the In of GVA PPS/Employment.

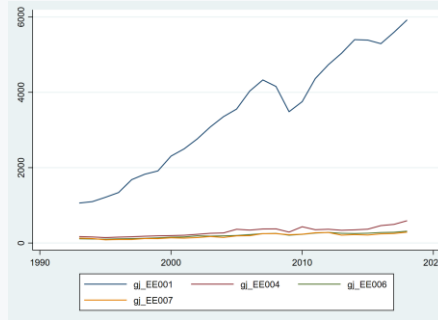
➤ **Further models under consideration:** Dynamic factor model, VAR, SVAR, Granger



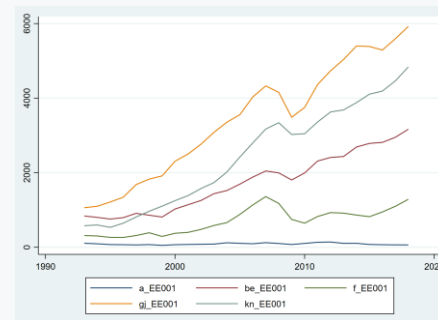
# RAW data. Estonia NUTS 3 regions, sectors A, B\_E, F, GJ, KN



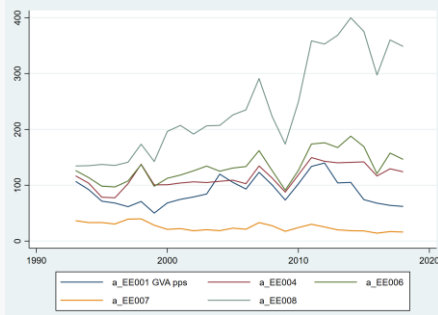
KN sectors of Estonia NUTS 3 regions



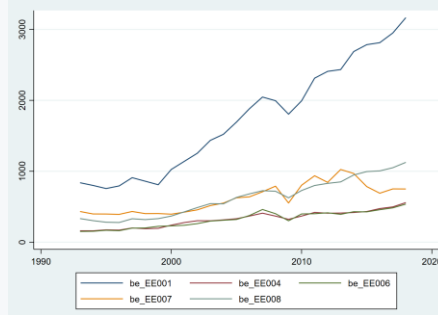
GJ sectors of Estonia NUTS 3 regions



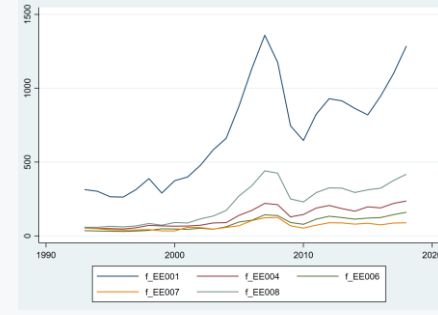
Estonia EE001, all sectors



A sector of Estonia NUTS 3 regions



B\_E sectors of Estonia NUTS 3 regions

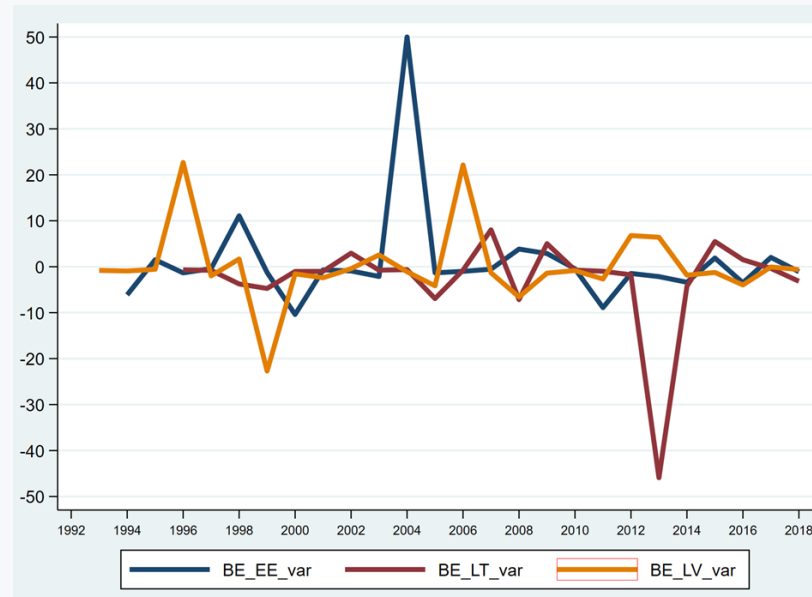
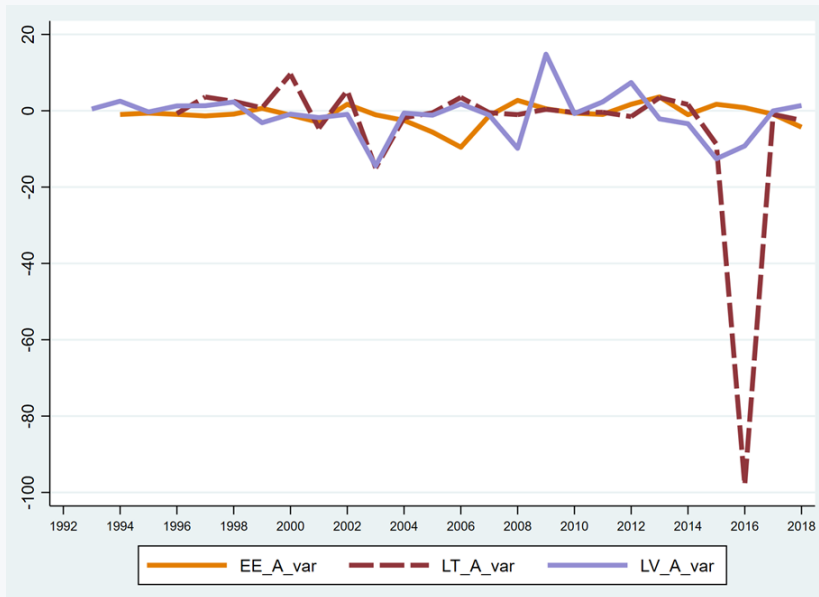


F sector of Estonia NUTS 3 regions

# SOME RESULTS (THE BALTIC STATES SAMPLE)



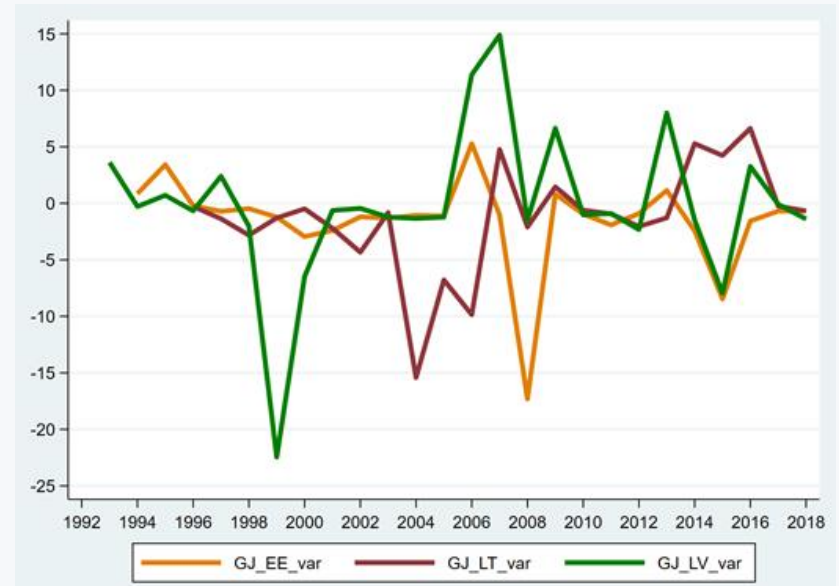
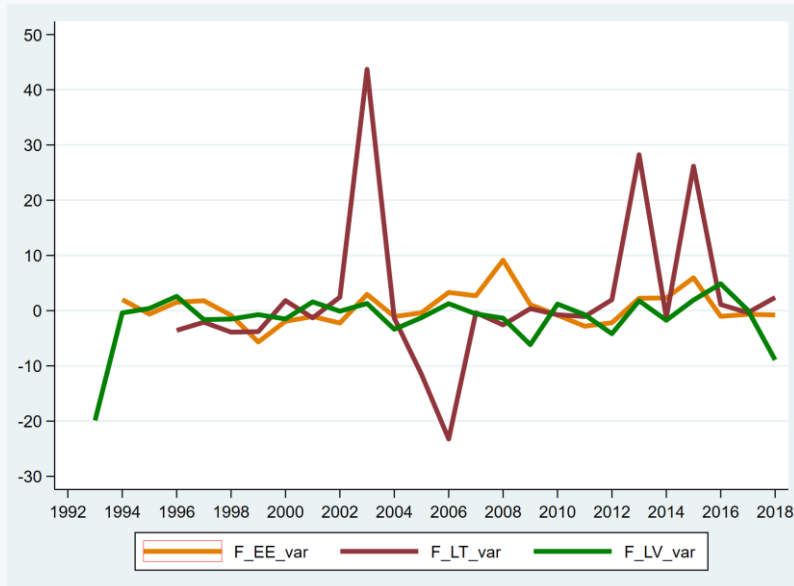
Coefficient of variance  $CV = \frac{\sigma_{kt}}{\mathcal{G}_{kt}}$



# SOME RESULTS (THE BALTIC STATES SAMPLE)



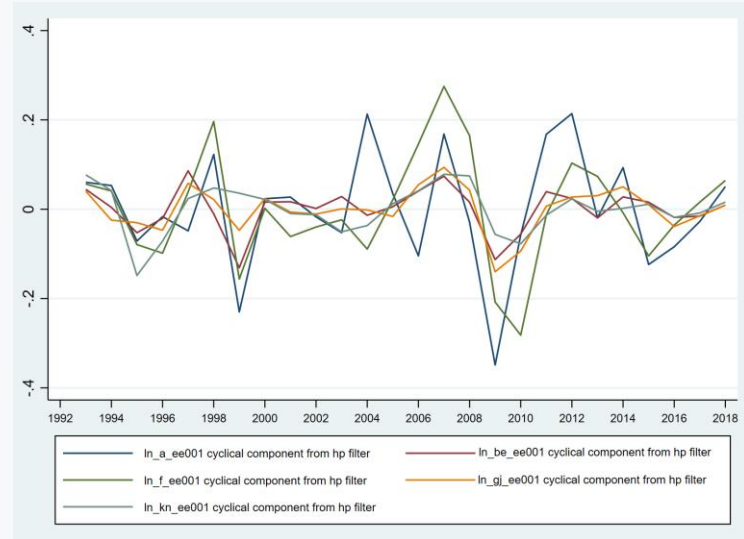
Coefficient of variance  $CV = \frac{\sigma_{kt}}{\mathcal{I}_{kt}}$



# Estonia NUTS 3 regions, sectors A, B\_E, F, GJ, KN



A sector, different regions



Different sectors, one region

# Estonia NUTS 3 regions, sectors BE, F



BE sector



F sector



# Estonia NUTS 3 regions, sectors GJ, KN



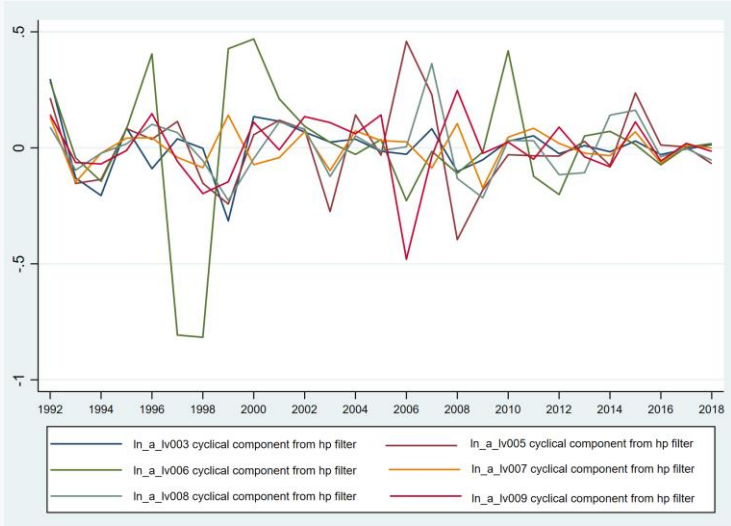
GJ sectors



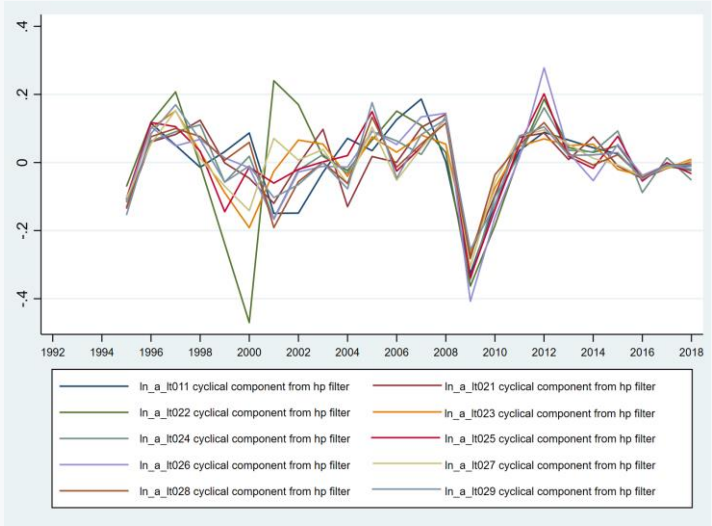
KN sector



# Lithuania & Latvia NUTS 3 regions, A sector



Latvia



Lithuania

# Lithuania & Latvia NUTS 3 regions, BE sector



Latvia

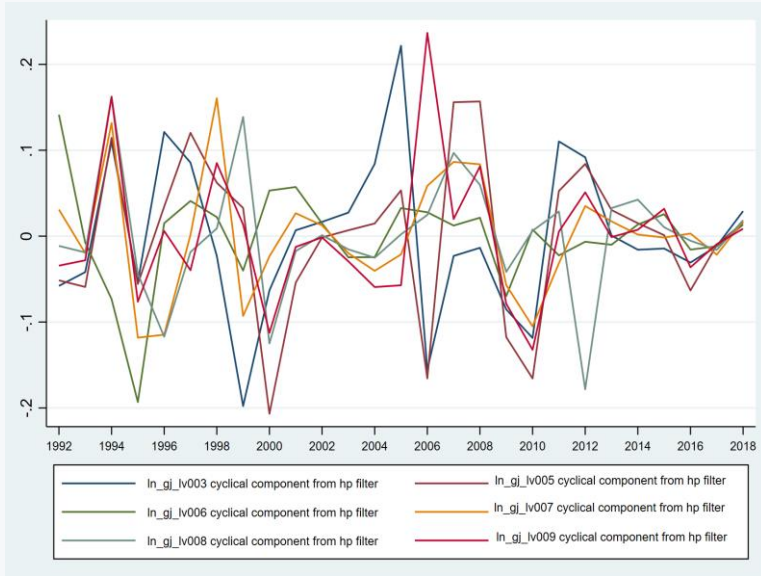


Lithuania

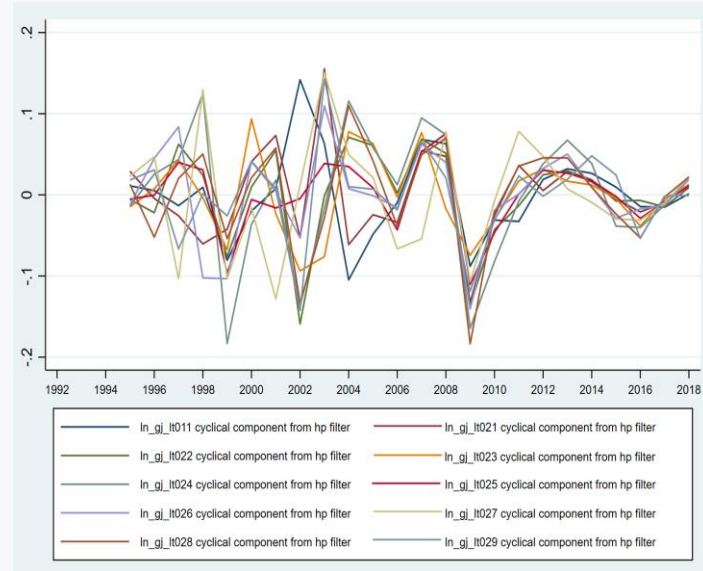




# Lithuania & Latvia NUTS 3 regions, GJ sector

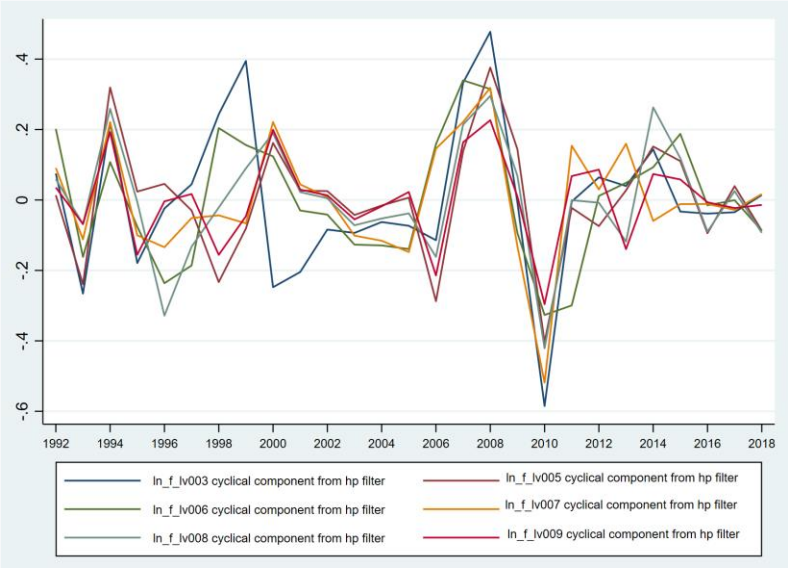


Latvia

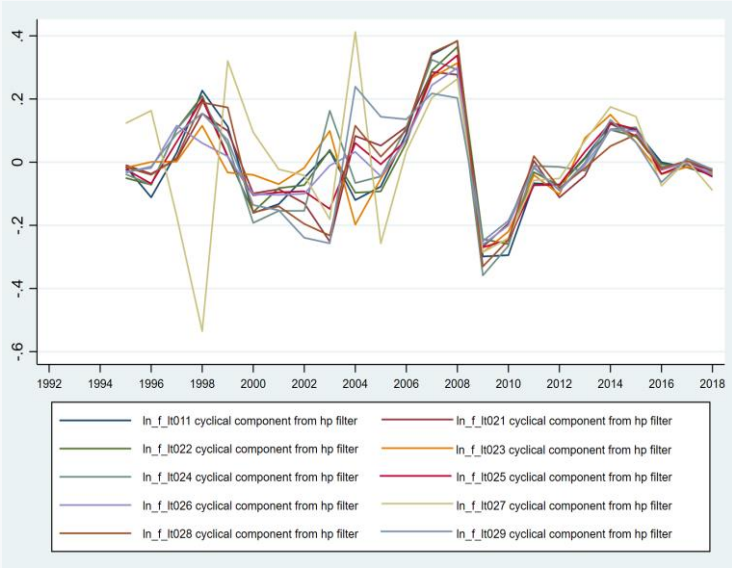


Lithuania

# Lithuania & Latvia NUTS 3 regions, F sector



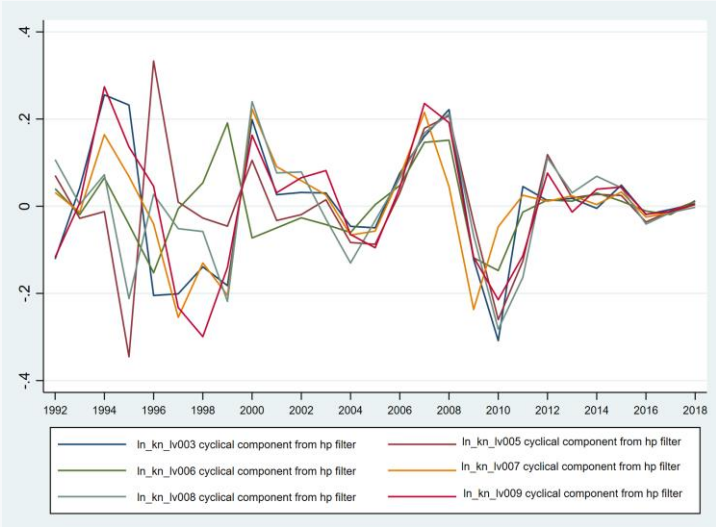
Latvia



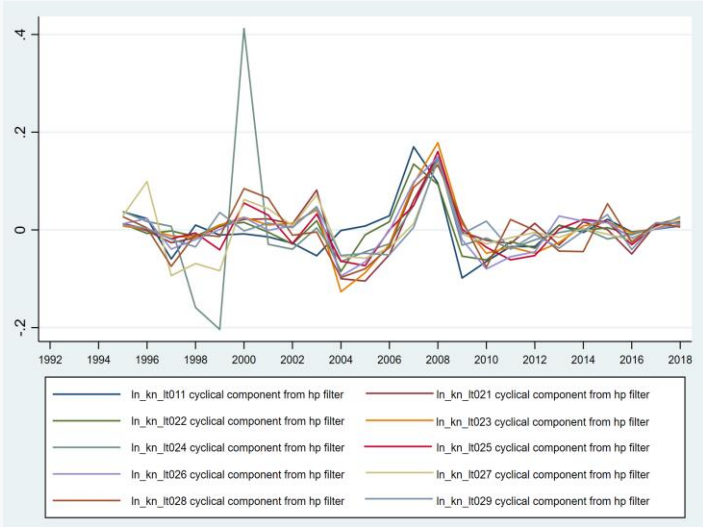
Lithuania



# Lithuania & Latvia NUTS 3 regions, KN sector



Latvia



Lithuania

## Some pairwise correlation results on BC HP. Estonia



Pair of sectors	Region
	EE001
A_BE	0.61***
A_F	0.52***
A_GJ	0.58***
A_KN	0.27
BE_F	0.65***
BE_GJ	0.82***
BE_KN	0.46**
F_GJ	0.82***
F_KN	0.69***
GJ_KN	0.64***

Region pair	A	BE	F	GJ	KN
EE001_EE004	0.66***	0.78***	0.82***	0.17	0.90***
EE001_EE006	0.74***	0.54***	0.69***	0.63***	0.85***
EE001_EE007	0.55***	0.51***	0.75***	0.34*	0.87***
EE001_EE008	0.76***	0.83***	0.91***	0.64***	0.89***
EE004_EE006	0.87***	0.67***	0.81***	0.41**	0.97***
EE004_EE007	0.81***	0.48**	0.64***	0.49**	0.88***
EE004_EE008	0.71***	0.70***	0.89***	0.55**	0.83***
EE006_EE007	0.78***	0.62***	0.66***	0.68***	0.91***
EE006_EE008	0.90***	0.68***	0.83***	0.55***	0.83***
EE007_EE008	0.67***	0.61***	0.72***	0.34**	0.81***

## Some pairwise correlation results on BC HP. Latvia



Region pair	A	BE	F	GJ	KN
LV003_LV005	0.54***	0.58***	0.53***	0.54***	0.07
LV003_LV006	0.06	0.39**	0.66***	0.05	0.33*
LV003_LV007	0.03	0.11	0.58***	0.12	0.76***
LV003_LV008	0.50***	0.46**	0.62***	-0.20	0.52***
LV003_LV009	0.26	0.41**	0.51***	-0.02	0.84***
LV005_LV006	0.01	0.21	0.41**	-0.03	0.22
LV005_LV007	0.16	0.21	0.60***	0.42**	0.19
LV005_LV008	0.65***	0.28	0.77***	0.36*	0.76***
LV005_LV009	-0.28	-0.18	0.83***	0.33*	0.36*
LV006_LV007	0.29	0.09	0.65***	0.32*	0.12
LV006_LV008	0.03	0.32	0.69***	-0.11	0.27
LV006_LV009	0.37**	-0.06	0.39**	0.05	0.20
LV007_LV008	0.10	0.48**	0.65***	0.34*	0.58***
LV007_LV009	0.24	0.46**	0.65***	0.66***	0.80***
LV008_LV009	0.06	0.60***	0.76***	0.40**	0.61***

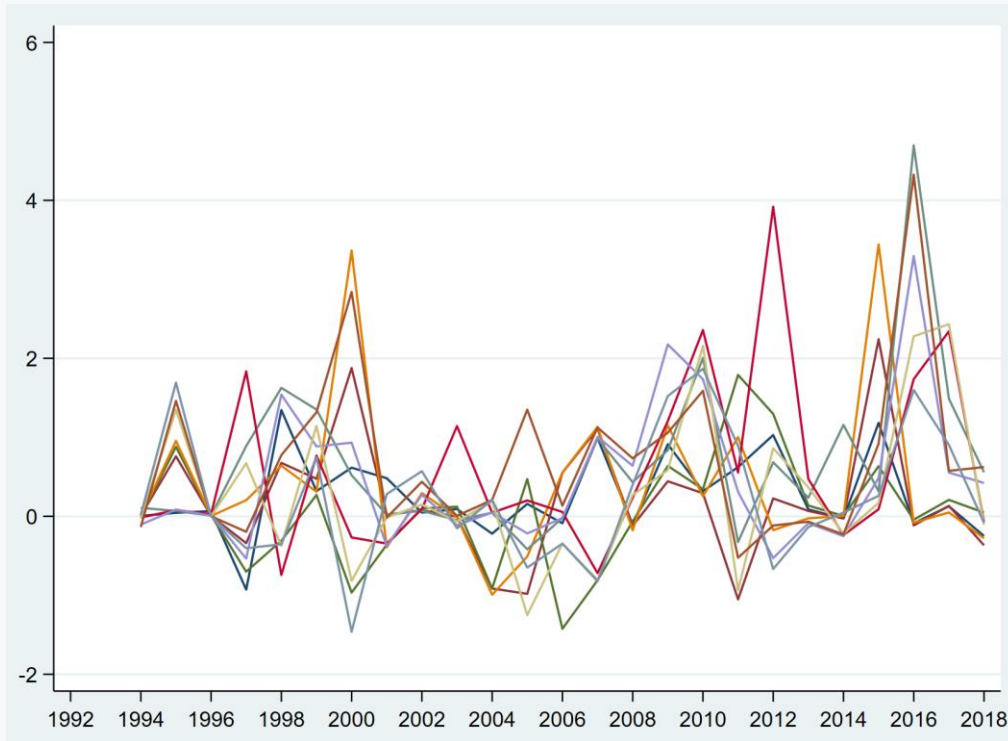
# Some pairwise correlation results on BC HP. Lithuania



Region pair	A	BE	F	GJ	KN
LT011_LT021	0.65***	0.84***	0.82***	0.48**	0.33
LT011_LT022	0.29	0.89***	0.98***	-0.05	0.81***
LT011_LT023	0.55***	0.85***	0.92***	-0.22	0.49**
LT011_LT024	0.77***	0.74***	0.94***	0.13	0.20
LT011_LT025	0.70***	0.66***	0.92***	0.52***	0.50**
LT011_LT026	0.82***	0.85***	0.92***	0.37*	0.65***
LT011_LT027	0.49**	0.69***	0.27	0.29	0.31
LT011_LT028	0.77***	0.80***	0.86***	-0.04	0.49**
LT011_LT029	0.70***	-0.03	0.66***	0.14	0.25
LT021_LT022	0.47**	0.90***	0.80***	0.44**	0.65***
LT021_LT023	0.80***	0.77***	0.69***	0.10	0.91***
LT021_LT024	0.86***	0.70***	0.76***	0.29	0.37*
LT021_LT025	0.76***	0.65***	0.94***	0.52***	0.83***
LT021_LT026	0.82***	0.81***	0.88***	0.75***	0.83***
LT021_LT027	0.78***	0.49**	0.43**	0.32	0.73***
LT021_LT028	0.85***	0.72***	0.98***	0.43**	0.77***
LT021_LT029	0.86***	0.17	0.93***	0.79***	0.88***

Region pair	A	BE	F	GJ	KN
LT022_LT023	0.84***	0.87***	0.92***	0.74***	0.80***
LT022_LT024	0.47**	0.80***	0.95***	0.88***	0.34*
LT022_LT025	0.62***	0.77***	0.92***	0.70***	0.72***
LT022_LT026	0.50**	0.91***	0.94***	0.62***	0.87***
LT022_LT027	0.78***	0.65***	0.21	0.15	0.42**
LT022_LT028	0.27	0.80***	0.84***	0.90***	0.65***
LT022_LT029	0.49**	0.10	0.66***	0.60***	0.49**
LT023_LT024	0.73***	0.83***	0.88***	0.68***	0.39*
LT023_LT025	0.79***	0.80***	0.82***	0.49**	0.89***
LT023_LT026	0.71**	0.79***	0.86***	0.46**	0.93***
LT023_LT027	0.91***	0.71***	0.24	0.04	0.66***
LT023_LT028	0.68***	0.79***	0.70***	0.71***	0.81***
LT023_LT029	0.79***	0.03	0.50**	0.37**	0.81***
LT024_LT025	0.91***	0.87***	0.86***	0.82***	0.57***
LT024_LT026	0.92***	0.84***	0.93***	0.53***	0.41**
LT024_LT027	0.73***	0.58***	0.22	0.41**	0.60***
LT024_LT028	0.73***	0.82***	0.82***	0.83***	0.50**
LT024_LT029	0.92***	-0.14	0.67***	0.51**	0.26

# Estonia A sector, different NUTS3 pairs Q correlation



## Further steps



Dynamic factor model

$$y_t^i = b_1^i f_t^{\text{region}(j)} + b_2^i f_t^{\text{country}(k)} + b_3^i f_t^{\text{subregion}(m)} + b_4^i f_t^{\text{global}} + u_t^i$$

$$u_t^i = \varphi_1^i u_{t-1}^i + \varphi_2^i u_{t-2}^i + \varepsilon_t^i, \quad \varepsilon_t^i \sim N(0, \sigma_{\varepsilon^i}^2)$$

$$u_t^i = \varphi_1 f_{t-1} + \varphi_2 f_{t-2} + \eta_t, \quad \eta_t \sim N(0, \sigma_{\eta}^2)$$

$y_t^i$  – vector of GVA growth rate of industry,  $f_t$  – factors,  $u_t^i$  – residuals

Factors & residuals are following an AR(2) process

**Setting up a model & controlling for regional, country, global, urbanization, distance & etc. factors**

**Challenge:** number of degrees of freedom

VAR model


$$Y_t = a_0 + a_1 Y_{t-1} + \dots + a_p Y_{t-p} + b_1 X_{t-1} + \dots + b_p X_{t-p} + u_t$$

$$X_t = a_0 + c_1 X_{t-1} + \dots + c_p X_{t-p} + d_1 Y_{t-1} + \dots + d_p Y_{t-p} + v_t$$



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# QUESTIONS, SUGGESTION?

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