

International business cycle  
indicators, measurement and  
forecasting

*Seminar at Sveriges Riksbank*

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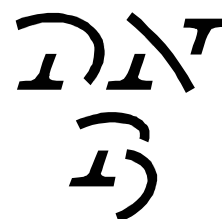
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# Outline of presentation

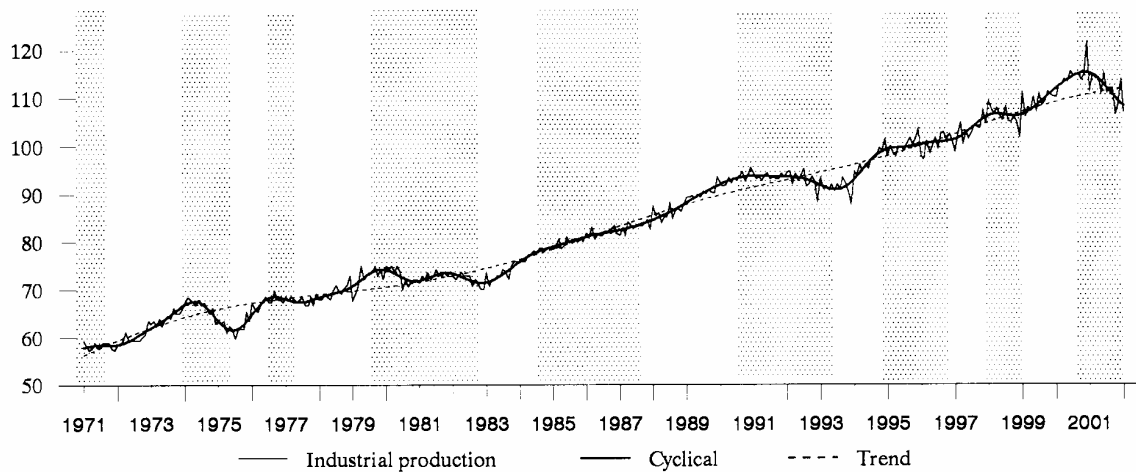
- Measuring business cycles
- Filtering techniques
- Descriptive statistics
- Leading indicators of the business cycle
- Further research

# Measuring the business cycle

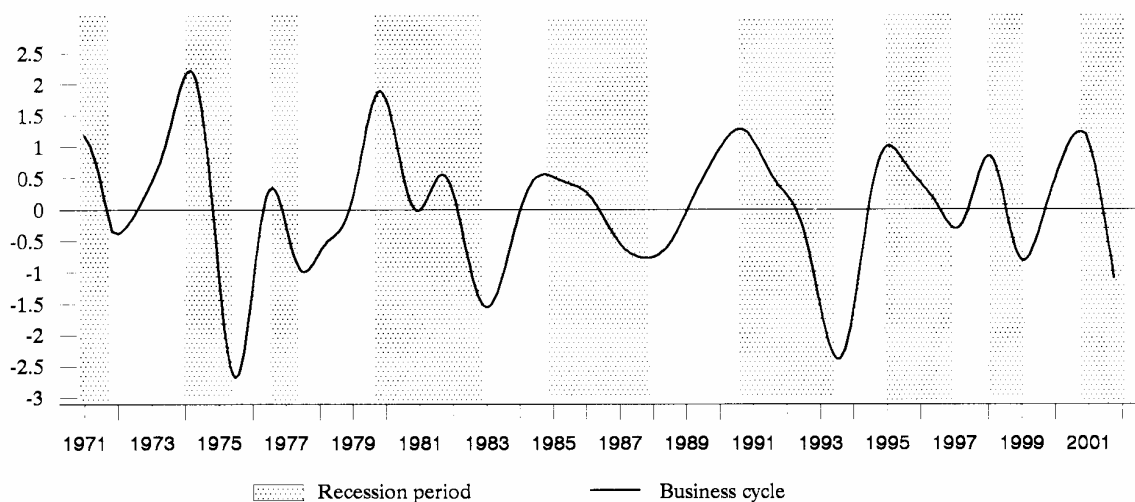
- Classical decomposition of time series into trend, cyclical, season and irregular
- Business cycle frequencies:
  - Stock&Watson (2000) 1.5-8 years
  - Agresti&Mojon (2001) 1.5-10 years
- Reference series: manufacturing output:
  - Close correspondence between cyclicity manufacturing output and gdp-growth (figure 1)
  - Theoretical: some expenditure components of GDP typically not necessarily contemporaneously procyclical
  - Practical: timely and monthly availability of production data (forecasting purpose)

Figure 1 Business Cycle Indicators and GDP-growth for the Netherlands

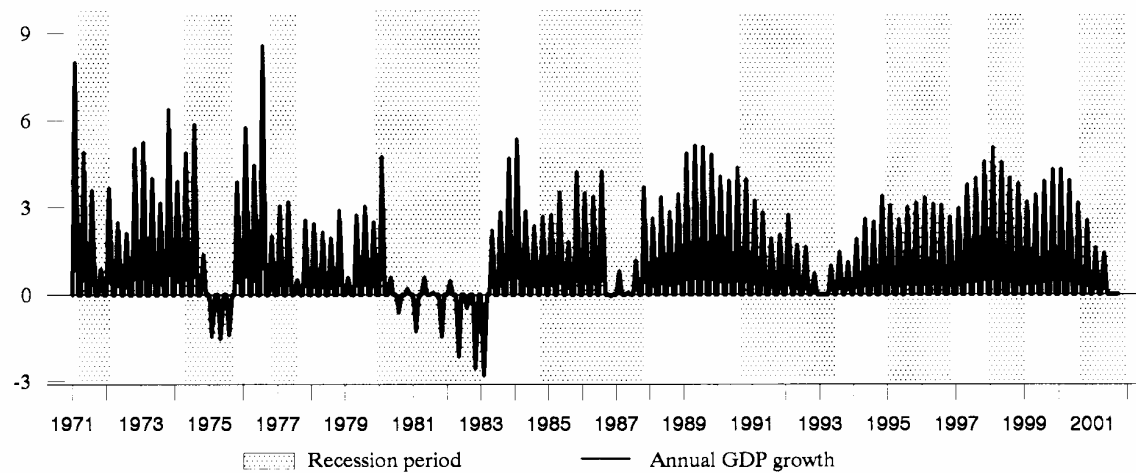
Industrial production, trend and cycle



Business cycle indicator Netherlands



GDP growth rates and cycle dating



# Filtering techniques

- HP-filter:
  - spurious cycles Cogley&Nason (1995)
  - trend frequencies: above on average 4-6 years
- Baxter&King (1999) –filter
  - renders (trending) series stationary
  - induces no phase shifts
  - however: trade-off between estimation efficiency and losing data
- Christiano&Fitzgerald (2003) –filter
  - more efficient estimation strategy by using weighting scheme, namely the typical spectral shape of macroeconomic time series.
  - More efficient estimation by using all available data at a negligible cost of phase shift and non-stationarity

# Bandpass Filtering

$$\min_{\hat{B}_j^{p,f} \quad j=-f, \dots, p} \int_{-\pi}^{\pi} f_x(\omega) \left| B(e^{-i\omega}) - \hat{B}^{p,f}(e^{-i\omega}) \right|^2 d\omega,$$

$$\hat{B}^{p,f}(L) = \sum_{j=-f}^p \hat{B}_j^{p,f} L^j,$$

$$B(e^{-i\omega}) = \begin{cases} 1 & \text{for } \omega \in (a, b) \\ 0 & \text{otherwise} \end{cases}$$

With  $f_x(\omega)$  is the spectral density of  $x_t$ .

Granger (1966), the ‘typical spectral shape’ of macroeconomic time series is one in which there is substantial power in a significant range of low frequencies

## Differences Christiano-Fitzgerald vs Baxter-King

- Stationarity condition  $\hat{B}(e^{i0}) = \hat{B}(1) = 0$
- No phase shift in case of symmetry  $p=f$
- Weighting scheme: BK  $f_x(\omega) = 1 \forall \omega$

# Empirical results: descriptive statistics

- Business cycle dating (Bry-Boschan algorithm): discrete analogue of  $dBCI/dt=0$  with rules (alternating top/trough,  $BCI$  must change sign and local optimum)
- Descriptive statistics: Standard deviation, skewness, kurtosis, duration, amplitude, steepness, sharpness
- Results:
  - Netherlands and Belgium, stability without moderateness, Japan opposite case.
  - US: pattern of smooth rounded peaks and pointed deep troughs
  - Germany: saw tooth; slow expansion phases combined with fast, deep recession phases

# Empirical results:

## international comovement

- Two measures:
  - Contemporaneous cross-correlation
  - Index of concordance: fraction of time two BCI are in the same phase.

$$IC_{ij} = \frac{1}{T} \sum_{t=1}^T \{S_t^i S_t^j + (1 - S_t^i)(1 - S_t^j)\}$$

- Result (sample of 25 years):
  - BCI United Kingdom more synchronised with BCI United States than with euro area (countries)



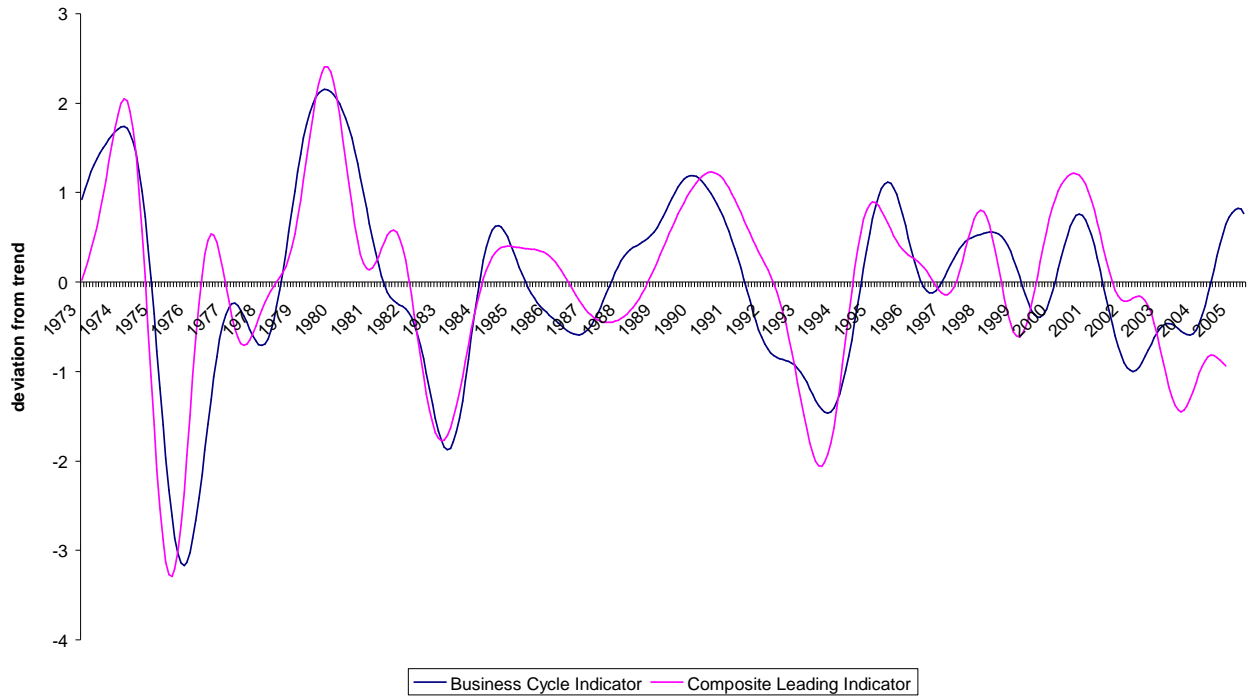
# Leading indicators

- Cross-correlation maximization with shifting
- Construct composite leading indicator which replicates and predicts the BCI:
  - selection on economic criteria
  - cross-correlation  $> 0.5$
  - leading with a minimum of 5 months
- Composite leading indicator one dimensional by standardising, synchronising and weighted averaging of selected basic leading indicators

# Results leading indicators

- **Monetary/financial indicators:** short and long term interest rates, equity price and monetary aggregate
- **Inventories:** non-matching economic flows: storage final products, level order position
- **Prices&Wages:** world market prices commodities, consumer price index, hourly wage industry, producer price, unit labour costs
- **Expectations&confidence:** IFO, several surveys, judgement order arrivals, consumer and producer confidence.

business cycle indicator Netherlands



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# Current research: real time accuracy

- Real-time accuracy of business cycle measurement:

- In terms of revisions: MARE

$$MARE_n = \frac{1}{(T-120-n)} \sum_{t=61}^{T-60-n} |BCI_{t|t+n} - BCI_{t|T}|$$

- In terms of real-time turning points:

