

KOF

The Use of Ever Increasing Datasets in Macroeconomic Forecasting

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12. Juni 2015

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Macroeconomic Forecasting Methods

- Indicator approach
 - Business tendency surveys
 - Buildings permits
 - Job advertisements
 - ...
- Econometric approaches
 - Time series econometrics
 - Structural econometric models

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KOF Business Tendency Surveys

- Manufacturing (M, Q)
- Construction (M, Q)
- Project Engineering (M, Q)
- Wholesale Trade (Q)
- Retail Trade (M)
- Gastronomy (Q)
- Hotel Business (Q)
- Banks (M, Q)
- Insurances (M, Q)
- Other Financial Services (M, Q)
- (Non-financial) Service Sectors (Q)
- KOF Consensus Forecast (Q)
- KOF Investment Survey (H)
- KOF Innovation Survey (2 years)

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KOF Business Tendency Surveys

1. Business situation

a) We judge our business situation overall as

good
 satisfactory
 poor

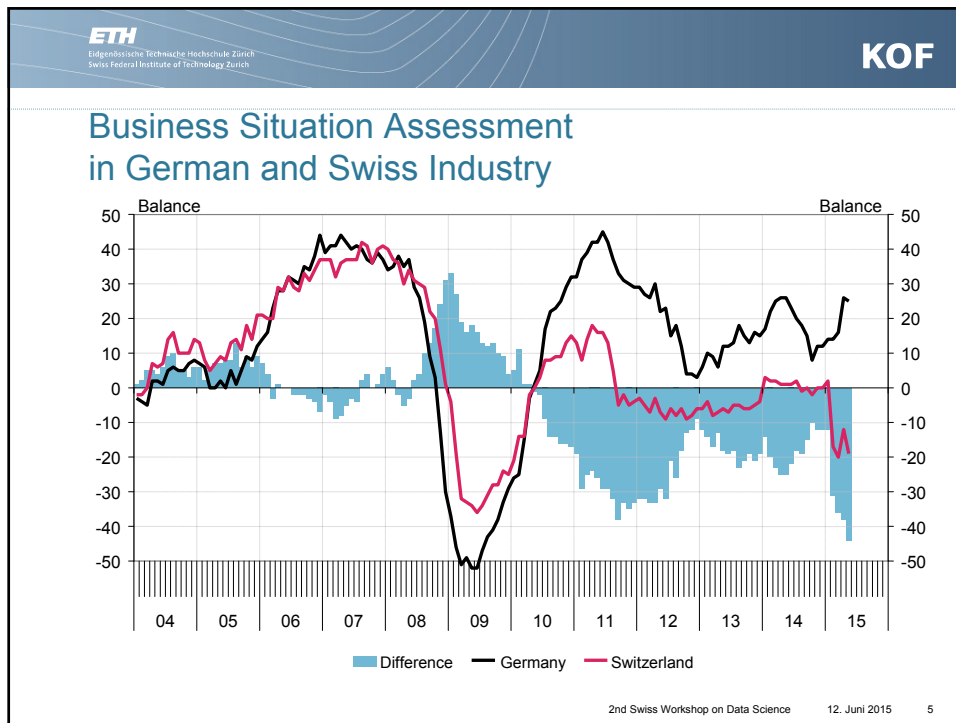
b) Over the last 3 months*, our business situation has

improved
 remained unchanged
 deteriorated

c) Over the next 6 months*, our business situation will

improve
 remain unchanged
 deteriorate

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Indicators and Forecasts at KOF

<p>Indicators</p> <ul style="list-style-type: none"> ▪ KOF Economic Barometer ▪ KOF Business Situation Indicator ▪ KOF Surprise Indicator ▪ KOF Employment Indicator ▪ KOF Monetary Policy Communicator ▪ KOF Baublatt Indicator ▪ KOF Globalisation Index ▪ KOF Youth Labour Market Index 	<p>Forecasts</p> <ul style="list-style-type: none"> ▪ KOF International Forecasts ▪ KOF Forecasts for Switzerland ▪ KOF Forecasts for Swiss Health Care Expenditures ▪ KOF Forecasts for Tourism in Switzerland ▪ Joint Economic Forecast for Germany ▪ Forecasts for the Construction Sector (Euroconstruct) ▪ Forecasts for Europe (EEAG)
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Econometric Approaches

The diagram consists of three main elements arranged horizontally. On the left, a large light-blue arrow points to the right, containing the text 'exogenous variables'. In the center, a solid black rectangle contains the word 'Model' in white, bold, sans-serif font. On the right, another large light-blue arrow points to the right, containing the text 'endogenous variables'. The arrows and the central box are connected, suggesting a causal or informational flow from left to right.

- Examples
 - autoregressive estimation approaches (time series)
 - Estimate an equation like: $C_t = \alpha + \beta C_{t-1} + \varepsilon_t$
 - theory-based estimation approaches (structural models)
 - Estimate equations like:

$$\begin{aligned} C_t &= \gamma + \delta Y_t + u_t \\ I_t &= \eta + \theta r_t + v_t \\ Y_t &= C_t + I_t \end{aligned}$$

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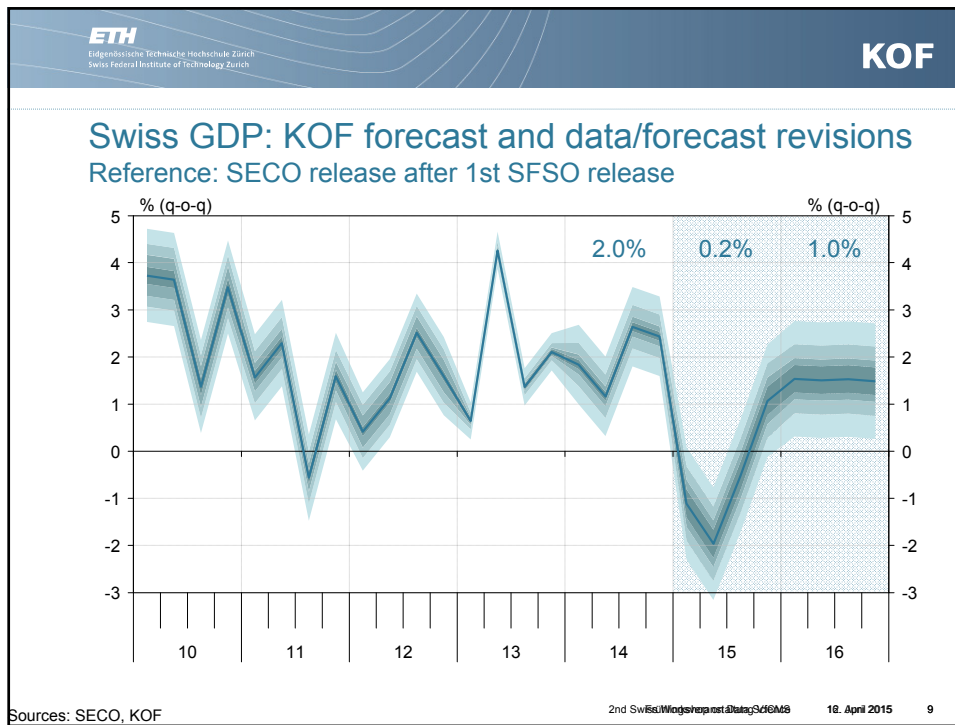
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KOF Macroeconometric Model

- The KOF macroeconometric model nowadays consists of
 - approximately 300 equations,
 - of which about 50 are behavioural equations
 - and is continuously being updated with new data allowing for changes in the behavioural equations
- (Smaller-scaled) models of the area experts are used to
 - provide estimates of “exogenous” variables
 - verify and adjust/update the macroeconometric model
- Currently we are working on a (large-scale) Bayesian VAR model
 - using priors coming from the area experts
 - producing confidence intervals for all variables

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KOF Economic Barometer

- Many composite leading indicators for business cycle developments exist around the world
 - OECD – Composite Leading Indicators for 47 countries/regions
 - The Conference Board – Leading Economic Indices for 13 countries
 - CEPR/Banca d'Italia – EUROCOIN
 - Many others – mostly at the national level
- Commonalities
 - Reference series needed
 - Selection of variables needed
 - Aggregation method needed
- Relationships and data availability changes over time
 - Once in a while an overhaul is needed
 - This is done at an ad hoc basis and is often time consuming
 - KOF Economic Barometer Versions: 1976, 1998, 2006, 2014

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Construction of the 2014 version

- Objectives
 - No longer use a filter for smoothing by broadening the set of underlying time series
 - Define a standardized procedure to select variables
 - Automatize and regularly apply the variable selection procedure
- Three production stages
 - Preparation phase (done once)
 - Choose business cycle concept, define the reference series, and define the automated selection procedure
 - Variable selection procedure (repeated annually)
 - Pre-select the pool of potential variables
 - Apply the automated selection procedure
 - Calculate the weights using principle component analysis
 - Construction of the leading indicator (repeated monthly)
 - Construct the monthly indicator using the extracted weights

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Comparing the 2006 and 2014 Versions

Version 2006	Version 2014
<ul style="list-style-type: none"> ▪ Reference series: <ul style="list-style-type: none"> ▪ y-o-y GDP growth ▪ Variable selection procedure <ul style="list-style-type: none"> ▪ Cross-correlation analysis ▪ Expert knowledge <ul style="list-style-type: none"> – Limited # var. selected ▪ No updating procedure ▪ Construction process <ul style="list-style-type: none"> ▪ Principal component analysis ▪ Filter to smooth indicator <ul style="list-style-type: none"> – The selected filter assures that only revisions in the underlying variables cause revisions in the KOF Barometer 	<ul style="list-style-type: none"> ▪ Reference series: <ul style="list-style-type: none"> ▪ smoothed m-o-m GDP growth ▪ Variable selection procedure <ul style="list-style-type: none"> ▪ Cross-correlation analysis ▪ Automated selection process <ul style="list-style-type: none"> – Large # var. selected ▪ Updated yearly ▪ Construction process <ul style="list-style-type: none"> ▪ Principal component analysis ▪ No filtering <ul style="list-style-type: none"> – Only data revisions in the underlying variables cause revisions in the KOF Barometer (within a vintage)

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Pre-selection of potential variables (2013 vintage of the 2014 Version)

- International variables: currently 32 variables
 - Concentrate on the 11 most important trading partners
 - 1 Business tendency & 1 consumer survey question per country
 - Ifo World Economic Survey, assessment and expectations for 5 regions
- National variables: currently 444 variables
 - KOF Business Tendency Surveys (411)
 - SECO Consumer Survey (9)
 - BFS, SECO, OZD, SNB (24)
- For each of these variables we determine all
 - sensible transformation (level, log level, quarterly difference, monthly difference, annual difference, balance, positive, negative) (4356)
 - theoretically expected sign of the correlation with the reference series
- Except for year-over-year differences, X12-ARIMA is used to seasonally adjust all variables and their transformations.

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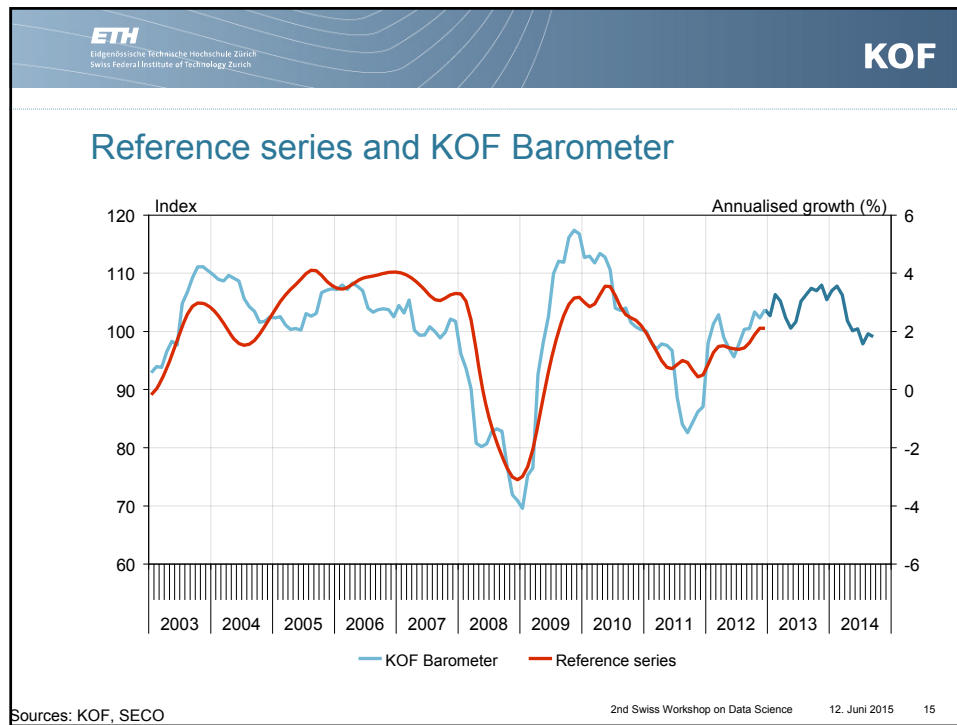
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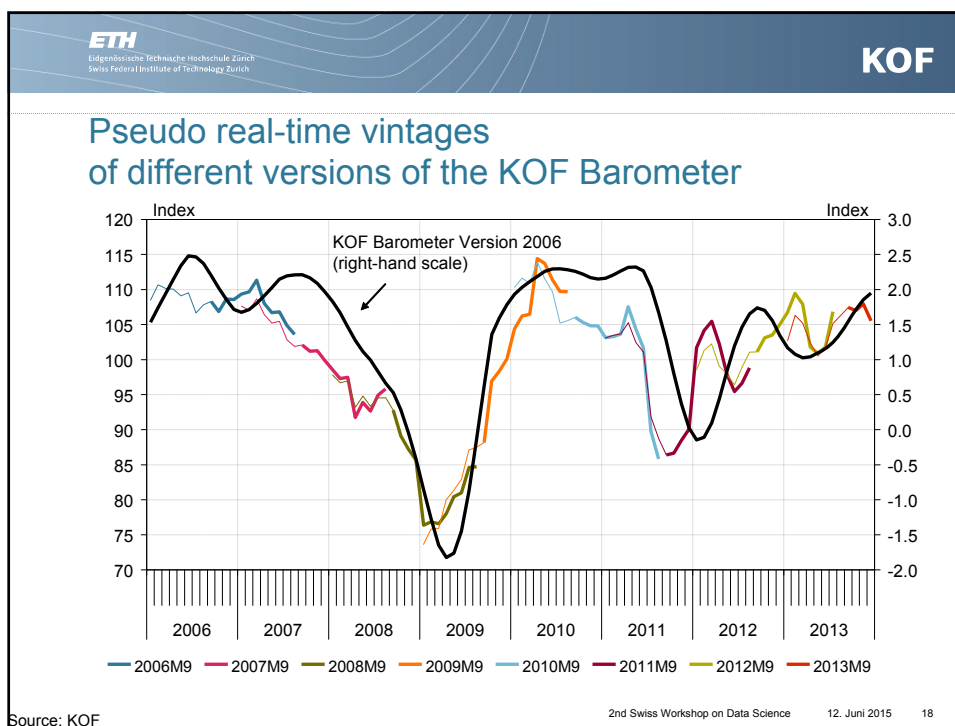
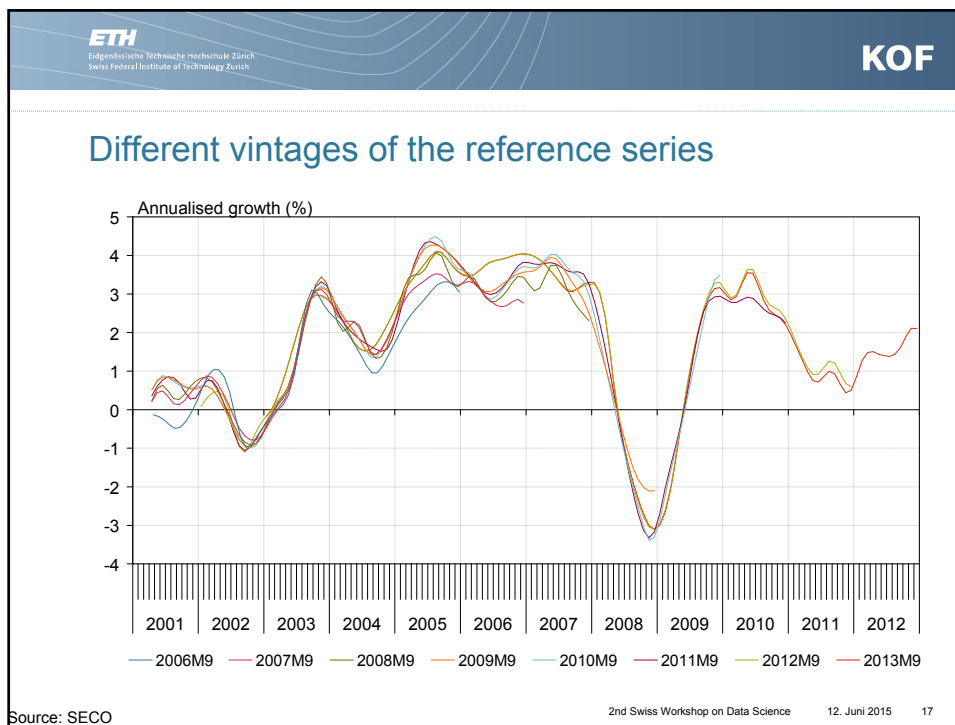
Automated selection procedure

- A variable has valid observations throughout the defined (10-year) observation window used in the cross-correlation analysis.
- The sign of the cross-correlation complies with the exogenously imposed sign restriction.
- Only those variables are retained, for which the maximum (absolute) cross-correlation is found at the lead range specified between 0 and 6 months.
- The computed cross-correlation surpasses a defined threshold.
- Of those transformations that survive, we take the one that optimizes:
 - $\max U = |r^{\max}| \times \sqrt{h^{\max} + 1}$
- Finally, the variance of these variables is collapsed into a composite indicator as the first principal component.
 - This first principal component is standardised to have a mean of 100 and standard deviation of 10 during the observation window.
 - (Dynamic factor analysis approach of Giannone et al. (2008) results in basically the same – using 2013 vintage, the correlation equals 0.998)

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- ### Yearly updates in September
- Swiss quarterly SNA is published by SECO
 - Swiss annual SNA is published by SFSO
 - Every summer a new vintage is released
 - This vintage contains the first release of previous year's growth by the SFSO
 - The subsequent quarterly release of SECO incorporates this annual information
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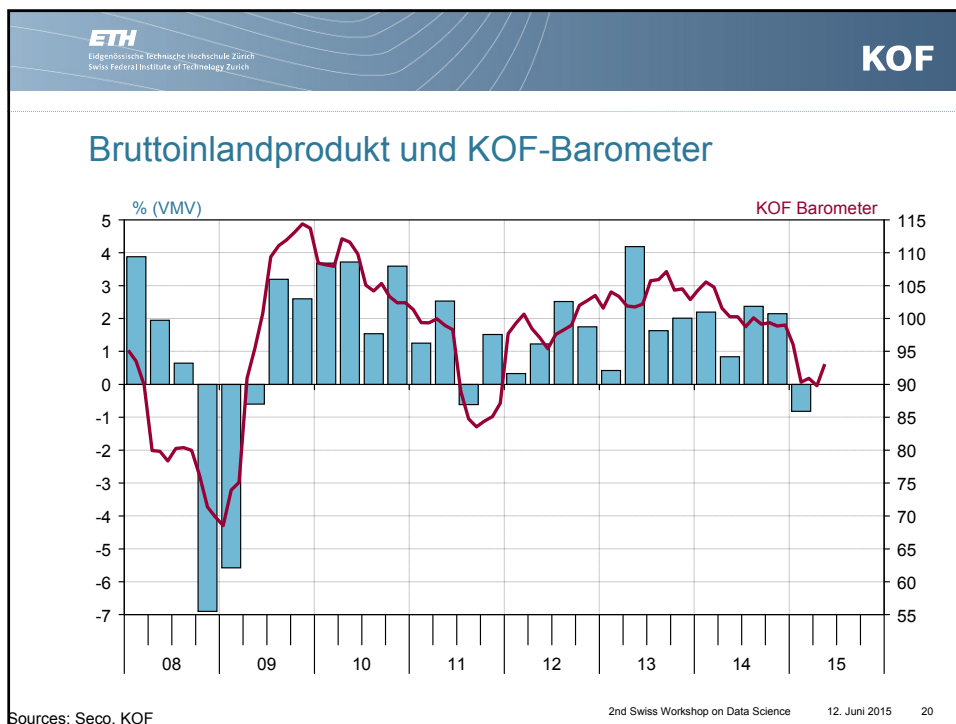
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Reasons for revisions between vintages

1. The 10-year reference window is shifted by one year.
2. Existing GDP data might be revised.
3. New variables might become available and some might no longer be published.

- Consequently, the set of variables selected and their loading coefficients might change from one vintage to another.
 - That is, we allow the composite indicator to learn using a largely automatised procedure

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Conclusions

- Forecasts and Indicators have become more data intensive
 - More and more time series have become available
 - KOF Economic Barometer uses about 5000 different time series
 - Computation time have gone down substantially
 - techniques to use this have been, and continue to be, developed
 - Estimating large-scale Bayesian VAR models
- Macroeconomic theory have become more micro-based
 - Macroeconomic researchers are more and more using firm-, consumer- and product-specific information
 - KOF Surprise Indicator (firm-specific information)
 - Research using product data from Swiss Customs Administration

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