

Diagnostic
Toolkit

Benkovskis et
al.

Diagnostic
toolkits

Existing
competitiveness
toolkits and indices

The CompNet toolkit

The
Anamnesis

Indicators of many
dimensions of
competitiveness

The database

The
Diagnostics

The model and the
methodology

The model and
parameter priors

The Etiology

Summary statistics

What indicators
matter?

A Diagnostic Toolkit for Competitiveness Assessment

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Competitiveness “toolkits”

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What indicators matter?

- Private and public institutions have built “Competitiveness Toolkits” or “Competitiveness indices”, e.g:
 - WB: Trade Competitiveness Diagnostic Toolkit and Doing Business Report
 - EC: European Competitiveness Report
 - The Latvian Competitiveness Report 2011
 - WEF: The Global Competitiveness Index, GCI
- The aim: understand the drivers in order to improve policy efficacy.
- The GCI is quantitative, used to “rank” countries
- Existing “diagnostic toolkits” more analytical, less quantitative

Our competitiveness toolkit in this context

- Similar to GCI and World Bank, LB toolkits: we look at many dimensions of competitiveness
- But not reduce competitiveness to an **index** or a **ranking**

Nonetheless more **quantitative** than other “toolkits”:

- Distinguish clearly between competitiveness **outcomes** and **drivers**
- Apply Bayesian model averaging to evaluate the relative impact of each driver on the outcomes
- Compare performance to that of a peer group
- Tease out what variables could have most “leverage” in each specific case.

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A comprehensive list of indicators

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What indicators matter?

Look at many dimensions of competitiveness (cyclical and structural):

- Prices and costs
- Macroeconomic Environment
- Labour Market
- Human Capital and Innovation
- Energy, Infrastructure and Institutions
- Business Environment
- Financial Development and Openness
- Firm characteristics
- Integration in global value chains

The underlying data

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What indicators matter?

- EU 27 Countries with exception of Croatia because of lack of Data.
- Data range from 2002 to 2011
- Drawing on many databases (data are comparable and refreshable):
 - Eurostat
 - AMECO
 - WDI
 - WGI
 - IFS
 - PWT
 - BIS
 - FDSO
 - OECD
 - ILO
 - EWN
 - Fraser Institute
 - CEPII

The methodological approach: BMA

Apply BMA to address model uncertainty on which variables $x^j \in x$ are in the true model M_j . For each model M_j :

Static panel with country-fixed effects

$$y_{it} = \alpha_i^j + x_{it-1}^j \beta^j + \epsilon_{it}^j \quad \forall t = 1, \dots, T \quad i = 1, \dots, n \quad (1)$$

$$E[\epsilon_{it}^j | \alpha_i^j, x_{i1}^j, \dots, x_{iT}^j] = 0 \quad (2)$$

where $\beta^j \in \mathfrak{R}_{k_j}$ ($0 \leq k_j \leq k$) groups the relevant regression coefficients

ϵ_{it}^j is a gaussian *IID* error term with variance σ^2 ,
 $\epsilon \sim \mathcal{N}(0, \sigma^2 I)$.

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BMA continued

The model weights are posterior model probabilities that arise from Bayes' theorem:

$$p(M_j|y, X) = \frac{p(y|M_j, X)p(M_j)}{p(y|X)} \quad (3)$$

where:

$p(y|M_j, X)$ is the marginal likelihood of model M_j

$p(M_j)$ is its prior probability

$p(y|X)$ is constant over all models.

The marginal likelihood $p(y|M_j, X)$ in turn depends on likelihood and priors of each model parameter:

$p(\alpha_j, \sigma)$

$p(\beta_j|\alpha_j, \sigma, M_j)$

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Specifying the priors

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To apply BMA we need to specify priors for:

- the generic model M_j
- the model's parameters α_j , β_j and σ

Model and parameter priors

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- Model prior: uniform prior over the model space
 - probability of including each regressor is 0.5
 - expected model size of $k/2$ is 24.5
- Improper priors on constant and error variance
 - complete uncertainty on where the prior is located
- Coefficient prior: g-prior

$$\beta_j | g \sim \mathcal{N} \left(0, \sigma^2 \left(\frac{1}{g} X_j' X_j \right)^{-1} \right)$$

→ The hyper-parameter g captures uncertainty: small g means “quite certain that the coefficients are zero”

Bayesian model sampling - summary statistics

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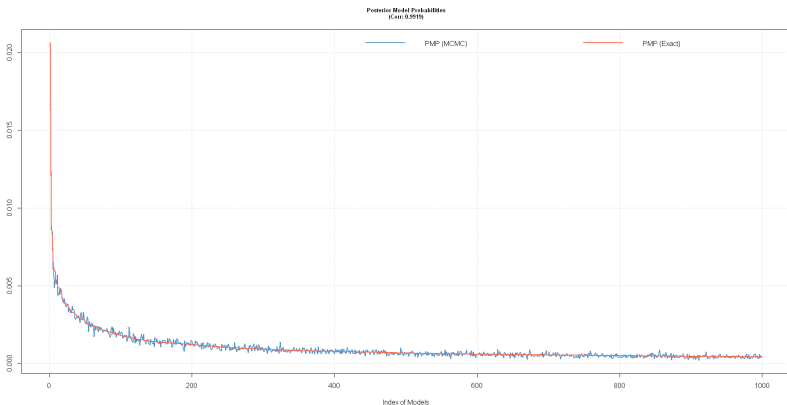
Table: Summary statistics

Mean no. regressors	15.9
Draws	10,000,000
Burnins	500,000
No. models visited	2,541,011
Modelspace 2^K	560,000,000,000,000
% visited	0.00000045
% Topmodels	5.6
Corr PMP	0.99
No. Obs.	260
Model Prior	uniform / 24.5
g-Prior	UIP

- High degree of convergence between analytical and numerical PMPs
- Only 5.6% of posterior model mass covered by top 1000 models: BMA preferable over BMS!

PMP-approximation for top 1000 models

Figure: Correlation of analytical and simulated posterior model probability



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Cumulative model probabilities

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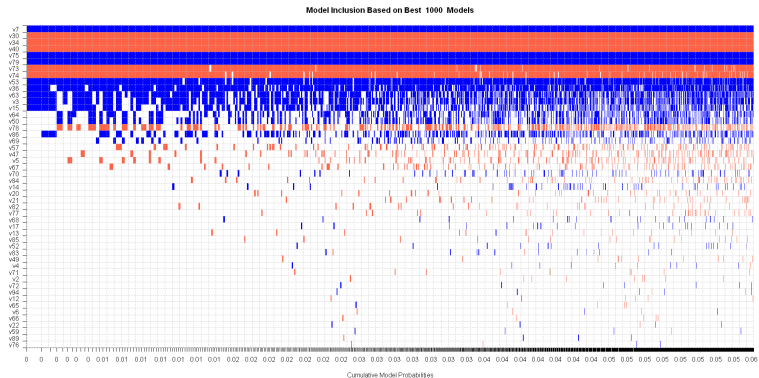
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Figure: Overview of the first 1000 models and their cumulative probabilities



Full agenda ahead

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- Robustness check with respect to the choice of the parameters and model priors
- Run additional estimations for the countries included in the DO.file exercise for which micro data is available
- Try to incorporate GVC indicators if any available for the considered period and for the entire set of countries
- Analysis based on clusters of countries
- Providing competitiveness maps of Europe in terms of both thematic indicators and overall performance
- Final aim: use for policy advice