Made in Italy Performance Bini & Velucchi

The Issu

The Goal

The Datase

The Model

The Results

Conclusions

Made in Italy Firms' Competitiveness: A Multilevel Longitudinal Model on Export Performance

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Made in Italy Performance

Bini & Velucchi

The Issue

- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

Introduction

- During the last decade, the Italian economy has experienced a significant slowdown in the rate of economic growth.
- Several reasons lie behind the Italian performance: a sharp decline in investments both in physical and human capital and in labor productivity.
- However, in the same period, "Made in Italy" sectors have been successful
- "Made in Italy" sectors are the 3F of the Italian economy (Food, Fashion and Furniture) and are usually considered the most dynamic and creative sectors in Italy (ICE, 2005; Brandolini and Cipollone, 2003; Rabellotti et al., 2009).

Made in Italy Performance

Bini & Velucchi

The Issue

- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

- In a sort of "polarization" of the economy, "Made in Italy" sectors have become worldwide famous and successful while the whole Italian economy was suffering from lost competitiveness.
- Several reasons behind:
 - Large debate on this.
 - "Made in Italy" sectors are more export-oriented
 - Firms involved in international activities are "different" from purely domestic firms: higher labor productivity, wages and skill intensity (Mayer and Ottaviano, 2007).
 - There are relatively few firms 'fit' to cope with the more competitive international markets and these firms are more productive, pay higher wages, employ more skilled workers, invest more in R&D (Giovannetti et al. 2009).

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

The Goal

- How the good performance of "Made in Italy" can be useful to stimulate all Italian economy? What are the factors that affected "Made in Italy" success?
- Investigate the factors affecting the export competitiveness of "Made in Italy" sectors in the period 1999-2005 at a firm level, distinguishing between firm-specific factors (size and labor productivity) from context-specific factors (geographical location and the presence of an industrial district in the region).
- Because of the hierarchical structure of the data, we use a longitudinal multilevel approach that simultaneously models individual and context factors that affect the firms export competitiveness.

13

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

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13

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

- The Dataset
- The Model
- The Results
- Conclusions

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The Goal Made in Italy Performance Bini & Velucchi The Issue The Goal The Dataset The Model

- Standard regression models assume independence of the observations. Firms working in the same region, instead, are likely to have positively correlated performance (i.e. presence of unobserved factors at geographical level).
- Firms behavior is in fact likely to be influenced by individual goals and characteristics as well as shaped by social and economic environment.

The Goal Made in Italy Performance Bini & Velucchi The Issue The Goal The Dataset The Model

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Dataset

Performance Bini & Velucchi

Made in Italy

The Issue

The Goal

The Dataset

The Model

- The Results
- Conclusions

• Panel (from Italian National Institute of Statistics):

- 1999-2005
- 1,381,996 limited liability firms of industrial and service sectors.
- The information record: Balance sheet, data of Business Register (ASIA) and Export surveys data.
- Available info on
 - legal structure and industry affiliation,
 - year of the start of activity (age of firms).
 - economic classification,
 - geographic localization,
 - events of reorganization (mergers and acquisitions)
 - presence of industrial district in the region
 - innovative capacity.
- We select information on "Made in Italy" sectors: 183,421 firms. 7 sectors:
 - Food
 - Apparel, Fashion and Leather

Dataset

Made in Italy Performance Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Dataset

Made in Italy Performance Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Dataset

Performance Bini & Velucchi

- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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Dataset

- Made in Italy Performance Bini & Velucchi

- The Dataset
- The Model

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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 - Apparel, Fashion and Leathen

- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
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- The Model
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Dataset

- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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- Made in Italy Performance Bini & Velucchi
- The Issue
- The Goal
- The Dataset
- The Model
- The Results
- Conclusions

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Dataset

- Made in Italy Performance Bini & Velucchi

- The Dataset
- The Model

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Dataset

- Made in Italy Performance Bini & Velucchi

- The Dataset
- The Model

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Dataset

- Made in Italy Performance Bini & Velucchi

- The Dataset
- The Model

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Dataset

- Made in Italy Performance Bini & Velucchi

- The Dataset
- The Model

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The Model

Longitudinal Multilevel Model

 Multilevel model allows to group observations in homogeneous geographical areas, where clustering is not an occasional nuisance, but an intrinsic characteristic of the population, explicitly considered in the model.

• This model allows to disentangle the effect of:

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Made in Italy Performance Bini & Velucchi

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Made in Italy Performance Bini & Velucchi

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Made in Italy Performance Bini & Velucchi

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Made in Italy Performance Bini & Velucchi

The Model

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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The longitudinal multilevel approach allows to simultaneously model

- **individual variables:** X_{t,i,j,h} h is the number of covariates and i is the firm in the j-th region
- **context variables:** *Z*_{*t,j,k*} *k* is the number of covariates and *j* the region.

The linear specification can be written as

$$Y_{t,i,j} = \alpha + \sum_{h=1}^{p} \beta_h X_{t,i,j,h} + \sum_{k=1}^{s} \gamma_k Z_{t,j,k} + u_{i,j} + v_j + \varepsilon_{t,i,j}$$

where i : 1, ..., n and j = 1, ..., r. $u_{i,j} \sim N(0, \tau^2)$ - the second level casual effects of the model. $v_j \sim N(0, \varphi^2)$ - the third level casual effects of the model.

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Made in Italy Performance

Made in Italy Performance

Bini & Velucchi

The Issu

The Goal

The Dataset

The Model

The Results

Conclusions

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Bini & Velucchi (2010)

Made in Italy Performance

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Bini & Velucchi (2010)

Made in Italy Performance

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Bini & Velucchi

The Issu

The Goal

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Bini & Velucchi (2010)

Made in Italy Performance

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Bini & Velucchi

The Issu

The Goal

The Dataset

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The linear specification can be written as

$$Y_{t,i,j} = \alpha + \sum_{h=1}^{p} \beta_h X_{t,i,j,h} + \sum_{k=1}^{s} \gamma_k Z_{t,j,k} + u_{i,j} + v_j + \varepsilon_{t,i,j}$$

where i : 1, ...n and j = 1, ...r. $u_{i,j} \sim N(0, \tau^2)$ - the second level casual effects of the model. $v_j \sim N(0, \varphi^2)$ - the third level casual effects of the model.

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Made in Italy Performance

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Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

Estimation in two steps:

Null Model:

$$Y_{t,i,j} = \alpha + u_{t,j} + v_j$$

Where α is the average of the overall population. L.R. test on τ^2 and on φ^2 : if the null hypothesis (absence of a second and third level in the data) is rejected, then a hierarchical effect (at a region level) is present and a longitudinal multilevel model is appropriate.

• General Model estimation.

Bini & Velucchi (2010)

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Descriptive Stats and Null Model Main Results

Conclusions

Descriptive Statistics

Variable	Description	Obs	Mean	Std.Dex	Min	Max
	F 110 1					
f_exp	Export/Sales	183421	0.21	0.28	0	1
haladd	Return on investments	177555	10.92	0.70	-0.45	12.83
roi	Return on net capital	183421	0.16	0.30	-1	1
roe	Return on earnings	183421	0.06	0.36	-1	1
roa	Added value (log)	183421	0.05	0.11	-1	1
compet	Added value/cost of labor	164840	140.69	61.71	-19.14	567.23
	belong to an industrial					
dummy_dist	dis trict	183421	0.49	0.50	0	1
age	Age of firm	183421	17.96	12.55	0	140
employees	Number of employees	183421	34.31	131.35	1	8506
inno	innovative capacity	183421	0.98	0.12	0	1

Likelihood Ratio Test	LR chi2 = 224.23			
	p-value>0.001			

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Descriptive Stats and Null Model Main Results

Conclusions

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		The Results	Main Re	sults			
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Made in Italy Performance		Dep Var: f_exp	Coef.	Std.Err.	z	P> z	
		Added	ober.	old.En.	-	I CIEL	
Bini & Velucchi		Value	0.0137	0.0009	15.86	<0.01	
		Roi	0.0112	0.0014	7.96	<0.01	
The Issue		Roe	0.0002	0.0011	0.21	0.83	
The Goal		Roa	0.0652	0.0056	11.71	<0.01	
		Compet	0.0002 0.0005	0.0000 0.0000	19.95 14.98	<0.01 <0.01	
The Dataset		Age Size	0.0008	0.0000	17.62	<0.01	
The Model		District	0.0033	0.0010	3.30	<0.01	
		Innovation	0.0906	0.0045	20.22	<0.01	
The Results		Cost of					
Descriptive Stats and Null		Labor	0.0199	0.0019	10.65	<0.01	
Model		Region_2	-0.0209	0.0180	-1.16	0.25	
Main Results		Region_3	0.0022	0.0008	1.22	<0.01	
Conclusions		Region_4	-0.0020	0.0034	-0.61	0.55	
		Region_5	0.0139	0.0020	6.95	<0.01	
		Region_6	0.0080	0.0029	2.77	<0.01 0.32	
		Region_7	-0.0029 -0.0053	0.0029 0.0020	-0.99 -2.67	<0.32	
		Region_8 Region 9	-0.0053	0.0020	-2.67	<0.01	
		Region_3	-0.0198	0.0033	-6.03	<0.01	
		Region_11	-0.0010	0.0030	-0.33	0.75	
		Region_12	-0.0106	0.0019	-5.68	<0.01	
		Region 13	-0.0140	0.0034	-4.13	<0.01	
		Region_14	-0.0351	0.0070	-5.04	<0.01	
		Region_15	-0.0159	0.0022	-7.21	<0.01	
		Region_16	-0.0134	0.0027	-4.92	<0.01	
		Region_17	-0.0474	0.0082	-5.78	<0.01	
		Region_18	-0.0251	0.0037	-6.81	<0.01	
		Region_19	-0.0200	0.0025	-8.15	<0.01	
		Region_20	-0.0222	0.0030	-7.28	<0.01	
		Sector_17	0.0531	0.0035	15.21	<0.01	
		Sector_18	0.1048 0.1542	0.0032 0.0036	32.34 43.22	<0.01 <0.01	
		Sector_19	0.1542	0.0036	43.22 7.13	<0.01	
		Sector_26	0.0368	0.0062	2.78	<0.01	
		Sector_29	0.0101	0.0000			■▶ ▲ ■▶ = ● ● ● ●
D' 1 0 1/-1		Maria Saraha			Co	mpstat 201	0 Paris, 22-27 August 2010 11
Bini & Velu	ucchi (2010)	Made in Italy	Performan	ice			13

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

Conclusive Remarks

- On the individual variables side, export competitiveness is strongly influenced by labor and suffers by cuts in the remuneration of the labor factor.
- Firms investing in innovation and productivity succeed in international markets, confirming Meyer and Ottaviano (2007).
- On the context variables side, geographical location and sector turn out to be important factors. Work in
 - North-East regions (Veneto, Lombardia and Friuli Venezia Giulia)
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 - represent extra-positive factors for export competitiveness of "Made in Italy" firms.

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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- Invest in human capital
- Protect the social capital

Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

Bini & Velucchi

The Issue

The Goal

The Dataset

The Model

The Results

Conclusions

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Made in Italy Performance

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The Issu

The Goal

The Datase

The Model

The Results

Conclusions

Thanks for your attention

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