SS2016 Università degli Studi di Salerno June 8th – June 10th, 2016

# PROCEEDINGS

of the 48th scientific meeting of the Italian Statistical Society

Editors: Monica Pratesi and Cira Pena ISBN: 9788861970618

# PLENARY SESSIONS

(A) E. Baldacci	Financial Crises and their Impacts: Data Gaps and Innovation in Statistical Production.
(B) D. Dunson	Probabilistic inference from big and complex data.
(C) S. Strozza	Foreign immigration in Italy: a forty-year-old history.

# SPECIALIZED SESSION (SPE)

# (SPE-01) Inference, sampling and survey design

P. Conti	Resampling from finite populations under complex designs: the pseudo- population approach. (Co-author(s): F. Andreis, D. Marella, F. Mecatti)
P. Righi	A joint use of model based and design based frameworks for defining optimal sampling designs. (Co-author(s): P. D. Falorsi)
A. Ruiz-Gazen	A unified approach for robustness in survey sampling. (Co-author(s): J. Beaumont, D. Haziza)
(SPE-02) Multivariate m	odels for risk assessment
M. Billio	A Bayesian nonparametric approach to macroeconomic risk. (Co-author(s): R. Casarin, M. Costola, M Guindani)
P. Cerchiello	Bank risk contagion: an analysis through big data. (Co-author(s): P. Giudici, G. Nicola)
L. De Angelis	A Markov-switching regression model with non-Gaussian innovations for systemic risk measurement. (Co-author(s): C. Viroli)
(SPE-03) Bayesian nonpa	arametrics
D. Durante	Bayesian Nonparametric Modeling of Dynamic International Relations. (Co- author(s): D. Dunson)
A. Guglielmi	Bayesian autoregressive semiparametric models for gap times of recurrent events. (Co-author(s): G. Paulon, M. De Iorio)
A. Rodriguez	Restricted Nonparametric Mixtures models for Disease Clustering. (Co- author(s): T. Xifara)

# **(SPE-04)** Statistical methods for the analysis of gene-environment interaction in the study of complex pathologies

C. Angelini	An introduction to next generation sequencing for studying omic-environment interactions.
L. Calciano	Statistical approaches for the evaluation of genetic associations in complex diseases: the heterogeneity of asthma phenotypes. (Co-author(s): L. Portas, S. Accordini)
Y. Pankaj	Improved case-only approach to study genome-wide gene-environment in- teraction. (Co-author(s): S. Freitag-Wolf, A. Dempfle, W. Lieb, M. Krawczak)
(SPE-05) Nonlinea	r time series
M. Niglio	Probabilistic properties of Self Exciting Threshold Autoregressive pro- cesses. (Co-author(s): F. Giordano, C. D. Vitale)
T. Proietti	Optimal prediction of stochastic trends. (Co-author(s): A. Giovannelli)
H. Tong	On model selection from a finite family of possibly misspecified mod- els. (Co-author(s): H. Hsu, C. Ing)
(SPE-06) Spatial a	nalyses in demography
F. Heins	Measuring residential segregation with spatial indices: an appraisal and applications for the metropolitan area of Rome. (Co-author(s): F. Benassi, F. Lipizzi, E. Paluzzi)
A. Mazza	Immigrants' settlement patterns in the city of Naples. (Co-author(s): G. Gabrielli, S. Strozza)
L. Natale	Native Immigration and Pull Factor Evolution in Italy: a Spatial Approach. (Co-author(s): A. Santacroce, F. G. Truglia)
(SPE-07) Recent d	evelopments in Volatility modeling
R. Casarin	Dynamic Model Averaging for Quantile Regression. (Co-author(s): M. Bernardi, B. Maillet, L. Petrella)
A. Rahbek	Testing volatility: consistency of bootstrap testing for a parameter on the boundary of the parameter space.
E. Ruiz	Asymmetric Stochastic Volatility Models: Properties and Estimation. (Co- author(s): V. Czellar, X. Mao, H. Veiga)
(SPE-08) Advance	s in ordinal contingency table analysis
L. D'Ambra	Dimensionality reduction methods for contingency tables with ordinal variables. (Co-author(s): P. Amenta, A. D'Ambra)
R. Lombardo	Modelling Trends in Ordered Three-Way Non-Symmetrical Correspon-

M. Riani Using Collapsing and Multiple Comparisons to Detect Association in Two Way Contingency Tables. (Co-author(s): S. Arsenis)

dence Analysis. (Co-author(s): P. Kroonenberg, E. Beh)

#### (SPE-09) Statistical models for directional and circular data

C. Ley	The WeiSSVM: a tractable, parsimonious and flexible model for cylindrical data.
G. Mastrantonio	The multivariate projected-skew normal distribution: Bayesian estimation and a hidden Markov model application.
A. Panzera	Circular density estimation via matching local trigonometric moments. (Co- author(s): M. Di Marzio, S. Fensore, C. C. Taylor)

#### (SPE-10) The interplay between frequentist and bayesian inference

C. Grazian	Classical inference for intractable likelihoods.
J. Hannig	Fusion learning for Interlaboratory Comparison. (Co-author(s): Q. Feng, H. Iyer, C. Wang, X. Liu)
F. Pauli	p-value in science: a review of issues and proposed solutions.

#### (SPE-11) Société Française de Statistique

B.H. Avner	Stochastic Block Model for Multiplex network: an application to a multilevel network of researchers
Y. Bennani	Nonnegative Matrix Factorization for Transfer Learning. (Co-author(s): I. Redko)
T. Laloe	Detection of dependence patterns with delay.
J. Poggi	Disaggregated Electricity Forecasting using Wavelet-Based Clustering of Individual Consumers. (Co-author(s): J. Cugliari, Y. Goude)

#### (SPE-12) National accounts

A. Coli	The European Welfare State in times of crisis according to macroeconomic official statistics. (Co-author(s): E. Micheletti, B. Pacini)
C. Martelli	National Account and Open Data: a new semantic approach.
G. Oneto	New information contents of the National Accounts for the monitoring of the economic situation.

# (SPE-13) Statistical tools for monitoring the educational system and assessing students' performances

L. Grilli	Evaluation of university students' performance through a multidimen- sional finite mixture IRT model. (Co-author(s): S. Bacci, F. Bartolucci, C. Rampichini)
G. Leckie	Monitoring school performance using value-added and value-table models: Lessons from the UK.
P. Sarnacchiaro	A statistical model to assess teacher performance. (Co-author(s): I. Camminatiello, R. Palma)

A.C. Monti	M Estimation based Inference for Ordinal Response Model.
E. Ruli	Approximate Robust Bayesian Inference with an Application to Linear Mixed Models. (Co-author(s): N. Sartori, L. Ventura)
J. Valeinis	Some robust methods using empirical likelihood for two samples. (Co- author(s): M. Velina, E. Cers, G. Luta)

#### (SPE-14) Robust inference by bounded estimating functions

# SOLICITED SESSION (SOL)

#### (SOL-01) Subjective wellbeing and demographic events over the life course

G. Fuochi	Cultural and institutional drivers of basic psychological needs satisfac- tion. (Co-author(s): P. Conzo, A. Aassve, L. Mencarini)
L. Mencarini	Five reasons to be happy about childbearing. (Co-author(s): A. Aassve, F. Luppi)
B. Nowok	Migration motivations and migrants' satisfaction in the life course: A sequence analysis of geographical mobility trajectories in the United Kingdom.
A. Pirralha	Does becoming a parent change the meaning of happiness and life satisfaction? Evidence from the European Social Survey. (Co-author(s): H. Dobewall)
(SOL-02) Statistics for eq	uitable and sustainable development
E. di Bella	Wellbeing and sustainable development: a multi-indicator approach to evaluate urban waste management systems. (Co-author(s): B. Cavalletti, M. Corsi)
C. Giusti	Small Area Estimation for Local Welfare Indicators in Italy. (Co- author(s): S. Marchetti, L. Faustini, L. Porciani)
T. Laureti	Does socio-economic variables influence the Italians' adherence towards a sustainable diet?. (Co-author(s): L. Secondi)
F. Riccardini	Sustainability of wellbeing: an analysis of resilience and vulnerability through subjective indicators. (Co-author(s): M. Bachelet, F. Maggino)
(SOL-03) New approaches to treat undercoverage and nonresponse	
F. Andreis	Methodological perspectives for surveying rare and clustered population: towards a sequentially adaptive approach.
E. Furfaro	Dealing with under-coverage bias via Dual/Multiple Frame designs: a simulation study for telephone surveys.

D. Haziza	Weight adjustment procedures for the treatment of unit nonresponse in surveys. (Co-author(s): É. Lesage)
E. Kabzinska	Empirical likelihood multiplicity adjusted estimator for multiple frame

surveys. (Co-author(s): Y. G. Berger)

#### (SOL-04) Statistical models and methods for network data

- M. Cugmas Measuring stability of co-authorship structures in time. (Co-author(s): A. Ferligoj)
- J. Koskinen A dynamic discrete-choice model for movement flows. (Co-author(s): T. Mueller, T. Grund)
- G. Ragozini Prototyping and Comparing Networks through Archetypal Analysis. (Coauthor(s): D. De Stefano, M.R. D'Esposito)
- S. ZaccarinModeling network dynamics: evidence from policy-driven innovation<br/>networks. (Co-author(s): A. Caloffi, D. De Stefano, F. Rossi, M. Russo)

#### (SOL-05) Recent developments in computational statistics

R. Argiento	A conditional algorithm for Bayesian finite mixture models via normalized point process.
S. Favaro	Thompson sampling for species discovery. (Co-author(s): M. Battiston, Y. Teh)
A. Mira	An application of Reinforced Urn Process to advice network data. (Co- author(s): S. Peluso, P. Muliere, F. Pallotti, A. Loni)
N. Sartori	Bootstrap prepivoting in the presence of many nuisance parameters. (Co- author(s): R. Bellio, I. Kosmidis, A. Salvan)

#### (SOL-06) Statisticians meet naturalists: issues on ecological and environmental statistics

F. Ferretti Estimating the abundance of wildlife ungulate populations in Mediterranean areas: methods, problems and findings. (Co-outhor(s): A. Sforzi)
M. Ferretti The monitoring of forests in Europe: methods, problems and proposals.
D. Rocchini The power of generalized entropy for biodiversity assessment by remote

sensing: an open source approach. (Co-author(s): L. Delucchi, G. Bacaro)

#### (SOL-07) From survey data to new data sources and big data in official statistics

G. Barcaroli	Machine learning and statistical inference: the case of Istat survey on ICT. (Co-author(s): G. Bianchi, R. Bruni, A. Nurra, S. Salamone, M. Scarnò)
S. Falorsi	Forecasting Italian Youth Unemployment Rate Using Online Search Data. (Co- author(s): S. Loriga, A. Naccarato, A. Pierini)
B. Liseo	Bayesian nonparametric methods for record linkage. (Co-author(s): A. Tancredi)

T. Tuoto	Exploring solutions for linking Big Data in Official Statistics. (Co- author(s): L. Di Consiglio, D. Fusco)	
(SOL-08) Symbolic data	analysis methods and applications	
E. Diday	Explanatory and discriminatory power of variables in Symbolic Data Analysis.	
M.B. Ferraro	Fuzzy and possibilistic approach to clustering of imprecise data. (Co- author(s): P. Giordani)	
L. Grassini	Symbolic data analysis approach for monitoring the stability of monu- ments (Co-author(s): B. Bertaccini, G. Biagi, A. Giusti)	
M. Ichino	Similarity and Dissimilarity Measures for Mixed Feature-type Symbolic Data. (Co-author(s): K. Umbleja)	
(SOL-09) Compositional	analysis	
L. Crosato	Forecasting CPI weights through compositional VARIMA: an application to Italian data (Co-author(s): F. Lovisolo, B. Zavanella)	
J. A. Martín-Fernández	Understanding association rules from a compositional data approach. (Co- author(s): M. Vives-Mestres, R. Kenett)	
A. Menafoglio	Object Oriented Geostatistical Simulation of Functional Compositions via Dimensionality Reduction in Bayes spaces. (Co-author(s): A. Guadagnini, P. Secchi)	
V. Simonacci	Fitting CANDECOMP-PARAFAC model for compositional data: a com- bined SWATLD-ALS algorithm. (Co-author(s): M. Di Palma, V. Todorov)	
(SOL-10) Sustainable de	velopment: theory, measures and applications	
F. Riccardini	Measuring sustainable development goals from now to 2030.	
F. Riccardini	How the nexus of food/water/energy can be seen with the perspective on well-being of people and the Italian BES framework. (Co-author(s): D. De Rosa)	
T. Rondinella	An innovative methodology for the analysis of sustainability, inclusion and smartness of growth through Europe2020 indicators (Co-author(s): E. Grimaccia)	
P. Ungaro	The Italian population behaviours toward environmental sustainability: a study from Istat surveys. (Co-author(s): I. Mingo, V. Talucci)	
(SOL-11) Detecting heterogeneity in ordinal data surveys		
E. Di Nardo	CUB models: a preliminary Fuzzy approach to heterogeneity. (Co-author(s): R. Simone)	
S. Giordano	Modelling uncertainty in bivariate models for ordinal responses. (Co- author(s): R. Colombi, A. Gottard, M. lannario)	

M. Manisera	Treatment of "don't know" responses in rating data: effects on the heterogeneity of the CUB distribution. (Co-author(s): P. Zuccolotto)
F. Pennoni	Modelling a multivariate hidden Markov process on survey data.
(SOL-12) Active ageing:	age management and lifelong learning strategies
P. E. Cardone	Age management in Italian companies. Findings of two Isfol surveys. (Co-author(s): M. Aversa, L. D'Agostino)
A. Lorenti	Working after Retirement in Europe.
C. Polli	Older low-skilled workers and economic crisis in Italy. (Co-author(s): R. Angotti)
G. Rivellini	Population ageing and human resources management. A chance for Applied Demography. (Co-author(s): F. Marcaletti, F. Racioppi)
(SOL-13) Statistical mod	lels for evaluating policy impact
M. Bia	Evaluation of Training Programs by exploiting secondary outcomes in Principal Stratification frameworks: the case of Luxembourg. (Co- author(s): F. Li, A. Mercatanti)
G. Cerulli	Testing Stability of Regression Discontinuity Models. (Co-author(s): Y. Dongz, A. Lewbel, A. Poulsen)
R. P. Mamede	Counterfactual Impact Evaluation of Vocational Education in Portugal. (Co- author(s): D. Cruz, T. Fernandes)
G. Pellegrini	Italian public guarantees to SME: the impact on regional growth. (Co- author(s): M. De Castris)
(SOL-14) Usage of geoco	ded micro data in the economic analysis
M. Dickson	Spatial sampling methods with locational errors. (Co-author(s): D. Filipponi)
D. Giuliani	Spatial Micro-Econometrics Models with Locational Errors. (Co-author(s): S. Cozzi, G. Espa)
F. Santi	Three-Year Survival Probability of Italian Start-up Businesses in Health- care Industry: an Empirical Investigation through Logistic Multilevel Modelling. (Co-author(s): M. M. Dickson, D. Giuliani, D. Piacentino)
(SOL-15) Statistical mod	lels in functional data analysis
G. Adelfio	Space-time FPCA Algorithm for clustering of multidimensional curves. (Co-author(s): F. Di Salvo, M. Chiodi)
C. Miller	Functional data analysis approaches for satellite remote sensing applica- tions. (Co-author(s): R. O'Donnell, M. Gong, M. Scott)
E. Romano	Order statistics for spatially dependent functional data. (Co-author(s): A. Balzanella, R. Verde)
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L. M. Sangalli	A penalized regression model for functional data with spatial depen- dence. (Co-author(s): M. S. Bernardi, G. Mazza, J. O. Ramsay)	
(SOL-16) Forecasting eco	nomic and financial time series	
G. Goracci	Asymptotics and power of entropy based tests of dependence for categori- cal data. (Co-author(s): S. Giannerini)	
M. M. Pelagatti	Forecasting electricity load and price: a comparison of different approaches. (Co-author(s): F. Lisi)	
G. Storti	Flexible Realized GARCH Models. (Co-author(s): R. Gerlach)	
(SOL-17) Immigrations and integration in Italy		
O. Casacchia	Minorities internal migration in Italy: an analysis based on gravity models. (Co-author(s): C. Reynaud, S. Strozza, E. Tucci)	
C. Conti	Growing generations and new models of integration.	
N. Tedesco	Measurement of segregation in the labour market. An alternative approach. (Co-author(s): L. Salaris)	
L. Terzera	Family behaviours among first generation migrants. (Co-author(s): E. Barbiano di Belgiojoso)	
(SOL-18) Open data, linked data and big data in public administration and official statistics		
G. Di Bella	Linked Administrative Data in Official Statistics: a Positive Feedback for the Quality?. (Co-author(s): G. Garofalo)	

- C. Martelli Generating high quality administrative data: new technologies in a national statistical reuse perspective. (Co-author(s): M. Calzaroni, A. Samaritani)
- V. Santarcangelo An innovative approach about the analysis of quality and efficiency in Italian law. (Co-author(s): A. Buondonno, A. Romano, M. Giacalone, C. Cusatelli)
- **B. Squiffieri** Prato municipality experience towards a high integration between administrative and statistical data.

#### (SOL-19) Evaluation of prognostic biomarkers

F. Ambrogi	Combining Clinical and Omics data: hope or illusion?. (Co-author(s): P. Boracchi)
L. Antolini	Graphical representations and summary indicators to assess the perfor- mance of risk predictors. (Co-author(s): D. Bernasconi)
P. Chiodini	Multivariable prognostic model: external validation and model recali- bration with application to non-metastatic renal cell carcinoma. (Co- author(s): L. Cindolo)

#### (SOL-20) Models for studying the mobility of students

S. Balia	Modelling inter-regional patient mobility: evidence from the Italian NHS. (Co-author(s): R. Brau, E. Marrocu)
A. D'Agostino	University mobility at enrollment: geographical disparities in Italy. (Co- author(s): G. Ghellini, S. Longobardi)
M. Enea	From South to North? Mobility of Southern Italian students at the transition from the first to the second level university degree.
F. Giambona	Measuring territory student-attractiveness in Italy. Longitudinal evidence.

# CONTRIBUTED SESSION (CON)

## (CON-01) Bayesian statistics (1)

F. Giummolè	Reference priors based on composite likelihoods. (Co-author(s): V. Mameli, L. Ventura)	
B. Nipoti	On Bayesian nonparametric inference for discovery probabilites. (Co- author(s): J. Arbel, S. Favaro, Y. W. Teh)	
R. Pappadà	Relabelling in Bayesian mixture models by pivotal units. (Co-author(s): L. Egidi, F. Pauli, N. Torelli)	
C. Scricciolo	On Deconvolution of Dirichlet-Laplace Mixtures.	
(CON-02) Statistical modeling		
P. Faroughi	A New Bivariate Regression Model for Count Data with Excess Zeros. (Co-author(s): N. Ismail)	
B. Francis	Dynamic latent class profiles in cross-sectional surveys: some preliminary results. (Co-author(s): V. Hoti)	
P. M. Kroonenberg	The use of deviance plots for non-nested model selection in loglinear models, structural equations, three-mode analysis.	
A. Lucadamo	Variable selection through Multinomial LASSO for PCMR. (Co-author(s): L. Greco)	
O. Paccagnella	Integrating CUB Models and Vignette Approaches. (Co-author(s): S.	

#### (CON-03) Demographics and social statistics (1)

Pavan, M. Iannario)

D. Bellani	Gender egalitarianism, education and life-long singlehood: A multilevel analysis. (Co-author(s): G. Esping-Andersen, L. Nedoluzhko)
L. Colangelo	Fear of Crime and Victimization among Sexual Harassed Women: Evi- dence from Italy. (Co-author(s): P. Mancini)

S. De Cantis	A survival approach for the analysis of cruise passengers' behavior at the destination. (Co-author(s): M. Ferrante, A. Parroco, N. Shoval)
A. Di Pino	Retirement of the Male Partner and the Housework Division in the Italian Couples: Estimation of the Causal Effects. (Co-author(s): M. Campolo)
F. Lariccia	Many women start, but few continue: determinants of breastfeeding in Italy. (Co-author(s): A. Pinnelli)

## (CON-04) Environmental statistics

F. Bono	Measuring sustainable economic development through a multidimensional Gini index. (Co-author(s): M. Giacomarra, R. Giaimo)
C. Calculli	Modeling multi-site individual corals growth. (Co-author(s): B. Cafarelli, D. Cocchi, E. Pignotti)
F. Di Salvo	GAMs and functional kriging for air quality data. (Co-author(s): A. Plaia, M. Ruggieri)
F. Durante	The Kendall distribution and multivariate risks.

#### (CON-05) Health statistics

E. di Bella	Dental care systems across Europe: the case of Switzerland. (Co- author(s): L. Leporatti, I. Krejci, S. Ardu)
F. Gasperoni	Multi-state models for hospitalizations of heart failure patients in Tri- este. (Co-author(s): F. leva, G. Barbati)
F. Grossetti	Multi-state Approach to Administrative Data on Patients affected by Chronic Heart Failure. (Co-author(s): F. leva, S. Scalvini, A. M. Paganoni)
G. Montanari	Evaluation of health care services through a latent Markov model with covariates. (Co-author(s): S. Pandolfi)

#### (CON-06) Labor market statistics

A. Bianchi	Multifactor Partitioning: an analysis of employment and firm size. (Co- author(s): S. Biffignandi)
G. Busetta	Ugly Betty looks for a job. Will she ever find it in Italy?. (Co-author(s): F. Fiorillo)
G. Busetta	No country for foreigners: an analysis of hiring process in Italian labor market. (Co-author(s): M. Campolo, D. Panarello)
F. Crippa	Know your audience. Towards a partnership between employers and university. (Co-author(s): M. Zenga)
I. Vannini	Online Job Vacancies: a big data analysis. (Co-author(s): D . Rotolone, C. Di Stefano, A. P. Paliotta, D. F. lezzi)

#### (CON-07) Robust statistics

F. Greselin	Robust estimation of mixtures of skew-normal distributions. (Co-author(s): L. García-Escudero, A. Mayo-Iscar, G. McLachlan)
M. Musio	Renyi's Scoring Rules. (Co-author(s): A. F. Dawid)
A. Paganoni	Robust classification of multivariate functional data. (Co-author(s): F. leva)
G. C. Porzio	A robust estimator for the mean direction of the von Mises-Fisher distri- bution. (Co-author(s): T. Kirschstein, S. Liebscher, G. Pandolfo, G. Ragozini)
F. Palumbo	Robust Partial Possibilistic Regression Path Modeling. (Co-author(s): R. Romano)

# (CON-08) Sampling methods

A. Ghiglietti	Adaptive Randomly Reinforced Urn design and its asymptotic properties.
D. Marella	PC algorithm from complex sample data. (Co-author(s): P. Vicard)
S. Missiroli	Optimal Adaptive Group Sequential Procedure for Finite Populations in the Presence of a Cost Function. (Co-author(s): E. Carfagna)
E. Pelle	The Rao regression-type estimator in ranked set sampling. (Co-author(s): P. Perri)
M. Ruggiero	Modelling stationary varying-size populations via Polya sampling. (Co- author(s): P. De Blasi, S. Walker)

## (CON-09) Economic data analysis

M. Brunetti	Getting older and riskier: the effect of Medicare on household portfolio choices. (Co-author(s): M. Angrisani, V. Atella)
E. Ciavolino	Modelling the Public Opinion on the European Economy with the HO- MIMIC Model. (Co-author(s): M. Carpita)
G. D'Epifanio	Indexing the Worthiness of Social Agents. To norm index on conventional specifications.
G. Guagnano	An econometric model for undeclared work. (Co-author(s): M. Arezzo)
M. Mussini	A spatial shift-share decomposition of energy consumption variation. (Co- author(s): L. Grossi)

# (CON-10) Quantile methods

M. Bernardi	Bayesian inference for $L_p$ -quantile regression models. Bignozzi, L. Petrella)	(Co-author(s): V.
V. Bignozzi	On the $L_p$ -quantiles and the Student t distribution. (C Bernardi, L. Petrella)	Co-author(s): M.
M. Marino	M-quantile regression for multivariate longitudinal data. ( Alfò, M. Ranalli, N. Salvati)	(Co-author(s): M.

D. Vistocco	Comparing Prediction Intervals in Quantile and OLS Regression. (Co- author(s): C. Davino)
(CON-11) Statistical alg	orithms
N. Loperfido	An Algorithm for Finding Projections with Extreme Kurtosis. (Co- author(s): C. Franceschini)
L. Scrucca	Poisson change-point models estimated by Genetic Algorithms.
A. Stamm	Maximum Likelihood Estimators of Brain White Matter Microstruc- ture. (Co-author(s): O. Commowick, S. Vantini, S. K. Warfield)
(CON-12) Statistics for 1	medicine
G. Barbati	Competing risks between mortality and heart failure hospital re-admissions a community-based investigation from the Trieste area. (Co-author(s): F. leva, A. Scagnetto, G. Sinagra, A. Di Lenarda)
C. Brombin	Evaluating association between emotion recognition and Heart Rate Vari- ability indices. (Co-author(s): F. Cugnata, R. M. Martoni, M. Ferrario, C. Di Serio)
M. Ferrante	Socio-economic deprivation, territorial inequalities and mortality for car- diovascular diseases in Sicily. (Co-author(s): A. Milito, A. Parroco)
M. Giacalone	The use of Permutation Tests on Large-Sized Datasets. (Co-author(s): A. Alibrandi, A. Zirilli)
(CON-13) Statistics for t	the education system
G. Boscaino	Further considerations on a new indicator for higher education student performance. (Co-author(s): G. Adelfio, V. Capursi)
C. Masci	Analysis of pupils' INVALSI achievements by means of bivariate multi- level models. (Co-author(s): A. Paganoni, F. leva, T. Agasisti)
A. Valentini	Promoting statistical literacy to university students: a new approach adopted by Istat. (Co-author(s): G. De Candia, M. Carbonara)
(CON-14) Testing proce	dures
E. Cascini	A Reliability Problem: Censored Tests.
G. De Santis	Testing the Gamma-Gompertz-Makeham model. (Co-author(s): G. Sali- nari)
M. M. Pelagatti	A nonparametric test of independence.
A. Pini	Functional Data Analysis of Tongue Profiles. (Co-author(s): L. Spreafico, S. Vantini, A. Vietti)
A. Vagheggini	On the asymptotic power of the statistical test under Response-Adaptive randomization. (Co-author(s): A. Baldi Antognini, M. Zagoraiou)
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## (CON-15) Time series analysis

C. Cappelli	Robust Atheoretical Regression Tree to detect structural breaks in financial time series. (Co-author(s): P. D'Urso, F. Di Iorio)
P. Chirico	Prediction intervals for heteroscedastic series by Holt-Winters methods.
M. Costa	Inequality decomposition for financial variables evaluation.
G. De Luca	Three-stage estimation for a copula-based VAR model. (Co-author(s): G. Rivieccio)

## (CON-16) Forecasting methods

M. Andreano	Forecasting with Mixed Data Sampling Models (MIDAS) and Google trends data: the case of car sales in Italy. (Co-author(s): R. Benedetti, P. Postiglione)
V. Candila	Probability forecasts in the market of tennis betting: the CaSco normaliza- tion. (Co-author(s): A. Scognamillo)
S. Vantini	Daily Prediction of Demand and Supply Curves. (Co-author(s): A. Canale)

## (CON-17) Bayesian statistics (2)

G. Marchese	Bayesian hierarchical models for analyzing and forecasting football re- sults. (Co-author(s): P. Brutti, S. Gubbiotti)
L. Paci	Bayesian modeling of spatio-temporal point patterns in residential prop- erty sales. (Co-author(s): A. E. Gelfand, M. Beamonte, P. Gargallo, M. Salvador)
V. Vitale	Non-parametric Bayesian Networks for Managing an Energy Market. (Co-

author(s): V. Guizzi, F. Musella, P. Vicard)

#### (CON-18) Business statistics

E. Bartoloni	How do firms perceive their competitiveness? Measurement and determinants.
С. Воссі	An evaluation of export promotion programmes with repeated multiple treatments. (Co-author(s): M. Mariani)
A. Righi	The inter-enterprise relations in Italy. (Co-author(s): A. Nuccitelli, G. Barbieri)

#### (CON-19) Clustering and classification

C. Drago	Dendrograms Stability Analysis of Sub-periods Time Series Cluster- ing. (Co-author(s): R. Ricciuti)
G. Menardi	Stability-based model selection in nonparametric clustering.
T. Padellini	Topological signatures for classification. (Co-author(s): P. Brutti)

## (CON-20) Demographics and social statistics (2)

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B. Arpino	What makes you feeling old? An analysis of the factors influencing perceptions of ageing. (Co-author(s): V. Bordone, A. Rosina)
G. De Santis	A (partial) solution to the intractability of APC models. (Co-author(s): M. Mucciardi)
G. Gabrielli	Partner reunification of first generation immigrants in Lombardy. (Co- author(s): A. Paterno, L. Terzera)

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N. Lunardon	On penalized likelihood and bias reduction. (Co-author(s): G. Adimari)
A. Maruotti	Population size estimation and heterogeneity in capture-recapture count data. (Co-author(s): O. Anan, D. Böhning)

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R. Salvatore	Spatial-temporal multivariate small area estimation. (Co-author(s): F. Cappuccio)
D. Toninelli	Is the Smartphone Participation Affecting the Web Survey Experience?. (Co- author(s): M. Revilla)

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M. Bernardi	Non-conjugate Variational Bayes Approximation. (Co-author(s): E. Ruli)
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A. Coli	Mapping local social protection data in Italy. (Co-author(s): B. Pacini, A. Valentini, S. Venturi)						
A. Cosma	Indirect inference for nonlinear panel data.						
I. L. Danesi	Cluster Analysis of Transactional Data in the Frequency Domain. (Co- author(s): F. M. Pons, C. Rea)						
L. Gabrielli	Using purchase market behavior to estimate collective well-being. (Co- author(s): G. Riccardi, L. Pappalardo)						
F. Giambona	The Bifactor Item Response Theory Model for the analysis of repeated measurements. An application to the measurement of Italian households' well-being. (Co-author(s): M. Porcu, I. Sulis)						
A. Lepore	A Bayesian short-term strategy for site specific wind potential assessment. (Co-author(s): P. Erto, B. Palumbo, M. Lepore)						
A. Magrini	Distributed-Lag Structural Equation Modelling: An Application to Im- pact Assessment of Research Activity on European Agriculture. (Co- author(s): F. Bartolini, A. Coli, B. Pacini)						
G. Mastrantonio	A multivariate circular-linear hidden Markov model for site-specific as- sessment of wind predictions by an atmospheric simulation system. (Co- author(s): A. Pollice, F. Fedele)						
F. Musella	Bayesian networks for supporting the digitization process in Italian schools. (Co- author(s): S. Capogna, M.C. De Angelis)						
B. Palumbo	Statistical approach in aerospace industry innovation. (Co-author(s): P. Erto, F. Tagliaferri, G. De Chiara, R. Marrone, C. Leone, S. Genna)						
B. Palumbo	Ship fuel consumption control and engineering approach to fault-detection. (Co- author(s): P. Erto, A. Lepore, L. Vitiello, C. Capezza, D. Bocchetti, A. D'Ambra, B. Antonelli)						
A. Petrucci	Small area model-based direct estimator for spatial data. (Co-outhor(s): C. Bocci, E. Rocco)						
F. Poggioni	Dynamic Quantile Lasso Regression. (Co-author(s): L. Petrella, M. Bernardi)						
A. Pramov	Estimating dependence within neuropsychological models for designing risk profiles of decision-makers						
A. Pramov	Confidence intervals for a partially identified parameter with bounds estimated by the minimum and the maximum of two correlated and normally distributed statistics.						

I. Primerano	Semantic Knowledge Detection in Open-ended Questionnaire. (Co- author(s): G. Giordano)
G. Ragozini	A joint approach to the analysis of time-varying affiliation networks. (Co- author(s): D. D'Ambrosio, M. Serino)
M. Restaino	Non-parametric estimators for estimating bivariate survival function under randomly censored and truncated data. (Co-author(s): H. Dai, H. Wang)
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E. Ruli	Optimal B-robust posterior distributions for operational risk. (Co-author(s): I. Danesi, F. Piacenza, L. Ventura)
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A. Vanacore	Statistics for Safety and Ergonomics in Design. (Co-author(s): A. Lanzotti, C. Percuoco, A. Capasso, F. Liccardo, B. Vitolo)
L. Zanin	Modelling transition probabilities in a flexible hierarchical logit frame- work: evidence from the Italian labour market. (Co-author(s): R. Cal- abrese)

# Measuring territory student-attractiveness in Italy. Longitudinal evidence

Misurare l'attrattività dei territori italiani per gli studenti universitari. Evidenze longitudinali

Francesca Giambona

1

**Abstract** The aim of this paper is to investigate the factors affecting university student mobility in Italy in a longitudinal perspective, by considering the flows across competing territorial areas supplying tertiary education programs. The Bradley-Terry modelling approach based on pair comparisons has been adopted to define the attractiveness of competing territories and a range of determinants related to the socio-economic characteristics of the areas as well as universities' resources. Data released by the Italian Ministry of Education (MiUR) are analysed for the academic years 2010/2011-2014/2015. The modelling approach considers score values for each territory and year, allowing to evaluate whether attractiveness. To this end, an index based on ranking changes, appropriately weighed with the differences in score values, is proposed. Empirical findings highlight that attractiveness depends not only on the educational programs, but also on territories' socio-economic factors, reflecting the well-known North-South divide that persists in time.

Abstract Lo scopo di questo contributo è quello di indagare i fattori che influenzano la mobilità degli studenti universitari in Italia in una prospettiva longitudinale, considerando i flussi in entrata ed in uscita tra aree territoriali che offrono formazione universitaria. A tal fine è stato specificato un modello statistico noto in letteratura come Bradley-Terry model. Tale modello, attraverso confronti a coppie tra territori, permette di misurare la loro attrattività considerando un insieme di fattori relativi alle caratteristiche socio-economico delle aree e alle risorse universitarie. I dati diffusi dal MIUR per gli anni accademici 2010/2011-2014/2015 hanno permesso l'analisi della mobilità degli studenti in prospettiva longitudinale. Il modello statistico utilizzato fornisce un valore (score) per ogni territorio e per ogni anno, permettendo di costruire una graduatoria dei territori. Al fine di considerare il miglioramento (peggioramento) di attrattività sia in termini di valore (score) che di rango è stato proposto un indice basato su cambiamenti nel posizionamento nella graduatoria, opportunamente pesato con le differenze dei valori di punteggio. I risultati ottenuti evidenziano che l'attrattiva dipende non solo dall'offerta formativa dei territori, ma anche da fattori socio-economici, riflettendo il noto divario Nord-Sud, divario che permane nel tempo: negli anni considerati circa la metà dei territori che perdono attrattività è nel Sud. Key words: university attractiveness, longitudinal, Bradley-Terry Model.

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#### **1** Introduction

The Italian university system is mostly public and is organised on a national basis. Universities are largely funded by central government authorities and student fees are relatively low. Since the early 1990s, universities have become autonomous institutions that decide how to spend their budgets to pursue institutional tasks, such as research, teaching, and services in the area where they are located (primarily in the health sectors with university hospitals). Central authorities assign each institution a yearly monetary provision that is mainly allocated based on the university's size (i.e., the number of the students enrolled). After more than twenty years of self-government, a number of Italian universities now suffer from the financial crisis, a high rate of dropouts, high unemployment or underemployed graduate rates and a low power to attract students from other territories. For these reasons, private and public stakeholders demand greater accountability from the system, and the central government assigns a portion of the yearly financial provision to each university based on certain indicators of performance. Among these indicators, particular attention is paid to features related to the student mobility and university attractiveness, both of which are monitored by tracking the number of incoming students from other areas. A debate has arisen on the factors that actually indicate the quality of universities and on the influence that public policies to finance universities have on the local economies. Focusing on the ability of universities to attract students in a territory, these debates have rarely investigated the determinants behind the flows of incoming students with respect to the characteristics of the territory.

The issue of student mobility primarily refers to studies of the immigration phenomenon, which is currently considered to comprise a number of push-and-pull factors. A number of authors have paid attention to its determinants emphasising the influence of the educational, political, social, cultural and economic conditions of the origins and destinations places on their mobility (Caruso and de Wit, 2013; Beine et al, 2012; Kahanec and Kralikova, 2011; Kratz, 2011; Agarwal et al., 2008; Baryla and Dotterweich, 2001). Empirical studies on student mobility can be divided into two main strands: studies on international student mobility, which focus on mobility across countries (e.g., Van Bouwel and Veugelers, 2009; de Wit, 2010; Kahanec and Kralikova, 2011; Caruso and de Wit, 2013), and studies on domestic student mobility, which focus on flows among territories within the same country (Dal Bianco et al., 2009; Ordine and Rose, 2007; Agasisti et al., 2007). From another point of view, student mobility can be analysed on a micro or macro perspective based on the variety of subjective or objective reasons.

With respect to the macro level of analysis, the emphasis falls on the attractiveness of places of destination considering some key "origin" and "destination" factors (Dal Bianco, 2009; Agasisti and Dal Bianco, 2007) or on the phenomenon of brain drain (Fratesi and Percoco, 2014; Ciriaci, 2012; Ordine and Rose, 2007; Makovec, 2006; Lupi and Ordine, 2006; Brunello and Cappellari, 2005). Indeed, student mobility has several implications in terms of socio-economic development (i.e., the net loss of human capital) and on the rate of innovation and economic growth of the origin regions (Fratesi and Riggi, 2007; Viesti, 2005) and in

terms of monetary resources transferred by the central government authorities to the universities based on their attractiveness (measured in terms of student mobility).

From a macro perspective, the existing empirical studies have mainly analysed student mobility in terms of the flows of incoming students (Dal Bianco, 2009; Agasisti and Dal Bianco, 2007), distinguishing the forced moving students (who migrate from a territorial area that does not have a university) and the free moving students (who migrate from a territory with tertiary education supply) (Giambona et al., forthcoming). In these approaches the use of macro-covariates, which vary across territories, helps to account for differences among alternative destinations (Dotti et al, 2013; Agasisti and Dal Bianco, 2007). The first group of covariates includes the socio-economic conditions of territories, whereas a second group of covariates refers to resources that the universities in the territory are able to receive for their academic supply (in terms of educational and research activities).

Recent empirical evidence has analysed the Italian South-North student mobility divide, indicating that returns to education depend on the specific institution attended and on the characteristics of territory where the university is located (Makovec, 2006; Brunello and Cappellari, 2005). These factors underlie that the labour mobility from Southern to Northern areas is reflected by student mobility and contributes to increase in the magnitude of the regional disparities (Fratesi and Percoco, 2014; Ordine and Rose, 2007). Indeed, Southern students who attend Northern universities show very little inclination to return to the South (Svimez, 2009), furthering the brain drain phenomenon.

In this framework, starting from the main recent empirical evidences for the academic year 2011/2012 (Giambona et al., forthcoming), this paper analyses student mobility across competing territories supplying tertiary educational programs in Italy, namely TETA (Tertiary Education Territorial Areas), over the academic years 2010/11, 2012/13 and 2014/15. The aim is to analyse the changes in attractiveness of TETAs occurred within this time span, in particular with respect to the North-South divide. The improvement/deterioration in attractiveness is evaluated by means of a specific index developed in Giambona and Vassallo (2013).

#### 2 The Bradley-Terry Model

The analysis of TETAs' attractiveness is focused on modelling student flows and uses an approach based on pairwise comparisons across competing territorial areas in Italy. Specifically, we distinguish between two typologies of migrant students: those who migrate from a territorial area that does not host a university, called "forced" migrant students (if they want to attend a university, they must migrate), and students who migrate from an area that has a tertiary education institution, named "free" migrant students (they have the opportunity to attend a university where they live, but they choose to move). In this contribution we model free students flows, whilst forced mover students have been considered to define a measure of the initial advantage of TETAs. The standard Bradley-Terry model (Agresti, 2002; Bradley and Terry, 1952) considers the territories to be players (e.g., *i* and *j*) with different abilities. If the ability of *i* (for i = 1,...,M) is higher than the ability of *j* (for all  $j\neq i$ ), the number of times that *i* beats *j* is expected to be higher than the number of times *j* "beats" *i*.

In a competition across territories for attracting students, this concept can be translated as the number of students who prefer the area *i* coming from the area *j*. The model specifies the probability that in a pairwise comparison between *i* and *j* (for *j* that range from 1 to M-1), at time *t* students prefer the area *i* to *j*, as follows:

pr(i beats j)<sub>t</sub> = 
$$\frac{\alpha_{it}}{\alpha_{it} + \alpha_{jt}}$$
 (1)

where  $\alpha_i$  and  $\alpha_j$  are the ability parameters that measure the intensity of an unobservable (latent) trait in the two players. In the analysis of students' mobility the ability parameters are the attractiveness parameter of the competing TETAs.

By expressing the model in the logit form, equation (1) becomes

$$logit[pr(ibeats j)_{t}] = \lambda_{it} - \lambda_{it}$$
(2)

where  $\lambda_{it} = \log \alpha_{it}$  and  $\lambda_{jt}$  may be fixed or random parameter. Based on the results of comparisons that share a common TETA, the attractiveness parameters of TETAs at each time *t* are estimated.

The basic model allows to make generalisations in several directions (Turner and Firth, 2013), for example, to specify ability as a function of covariates. If player covariates ( $r = 1 \dots p$ ) are used to explain differences in players' abilities, the parameters  $\lambda_{it}$  and  $\lambda_{it}$  are related to the covariates by a linear predictor:

$$\boldsymbol{\lambda}_{it} = \sum_{r=1}^{p} \boldsymbol{\beta}_{r} \boldsymbol{x}_{irt} + \boldsymbol{U}_{it}$$
(3)

and equation (2) becomes

logit[pr(ibeats j)<sub>t</sub>] = 
$$\sum_{r=1}^{p} (\mathbf{x}_{irt} - \mathbf{x}_{jrt}) \boldsymbol{\beta}_{rt} + U_{it} - U_{jt}$$
 (4)

where  $U_{it}$  and  $U_{jt}$  are normally distributed random terms. Missing observations among covariates are handled by considering the individual parameters of the players containing missing predictor values as fixed effects (Turner and Firth, 2013). In the framework of the Bradley-Terry models, differences in attractiveness parameters (as measured by a fixed or random parameter shared by all pairs in which the same territory is involved) are the factors that lead students to prefer one TETA over another.

Finally, for each TETA, the change over time in attractiveness has been evaluated through the index  $I_i$  based on the annual changes in rank ( $\Delta R$ ) appropriately weighed with the annual differences of the score ( $\Delta S$ ) (Giambona and Vassallo, 2013):

$$\boldsymbol{I}_{i} = \sum_{t=2013}^{2015} (-\Delta \boldsymbol{R}_{t,i}) \cdot \frac{|\Delta \boldsymbol{S}_{t,i}|}{\sum_{i=1}^{m} |\Delta \boldsymbol{S}_{t,i}|}$$
(5)

#### **3** Empirical findings

Student mobility is defined in terms of the number of *free* students who move from their place of residence to attend a university degree program in another territory. The data were provided for the academic years 2010/2011, 2012/2013 and 2014/2015 by the Italian central government department for the university (ANS, MiUR). On the basis of the location of traditional universities in the country, the Italian territory has been divided into 50 TETAs supplying educational programs and thus in competition to attract students.

To describe the socio-economic characteristics we considered the findings of the survey carried out by the daily newspaper *Il Sole 24 Ore* on 36 factors related to the main domains of living conditions in the Italian provinces. These factors refer to standard of living, business and work, health and environmental services, population, public order, and leisure, and the overall quality of life index summarizing these domains (QUALITYOFLIFE).

To describe the effect of the characteristics strictly related to the tertiary education supply in TETAs we considered: (a) TETAs' capability to attract yearly financial provisions from the central government (BENEFIT); (b) a measure of the overall quality of universities located in a TETA with respect to services provided to students (CENSISQUALITY). Specifically, the BENEFIT indicator was calculated by considering the share of "benefit" over the total amount of central government provisions for each university. For TETAs hosting different university institutions, we considered the average values of each indicator.

Further, we added two measures to account for the capability of each TETA to attract students from territories without universities in terms of amount of the flow (INCIDENCE) and heterogeneity (HETEROGENEITY) of the territories from which they come from (Giambona et al., forthcoming). The combination of these two measures measures the *initial advantage* of each TETA with respect to the others in attracting students. Specifically, the *incidence* index (INCIDENCE) measures the percentage of forced movers in each TETA on the total forced movers, whilst the *heterogeneity* index (HETEROGENEITY) stands for the capability of each TETA to attract students from few or many Italian provinces without universities. To this aim, the Gini index of heterogeneity (Leti, 2001) is used to describe for each TETA the variability of the distribution of forced mover students by province of residence. The two indexes aim to control for any initial advantage of a TETA in measuring its relative ability to attract students. As a further measure of initial advantage, we include an indicator which counts the number of adjacent provinces without universities (PROVADWITHOUT).

The physical distance between TETAs was not considered because in Italy there is no clear correspondence between physical distances and time and moving costs. For example, the widespread presence of low-cost airlines make it sometimes cheaper and faster to move from South or Centre to North than to reach adjacent TETAs. In this perspective, to account for transportation facilities, we included the number of railway stations (STATIONS) and the presence of airports (AIRPORTAVAILABILITY).

The results of the analysis using the Bradley-Terry model (Table 1) indicate that the QUALITYOFLIFE has a positive and significant effect on attractiveness as well as the indicators related to the university domains (BENEFIT and CENSISQUALITY). TETAs with higher values of initial advantage (HETEROGENEITY, INCIDENCE) are more attractive than the others, and if the TETA is located near provinces without universities (PROVADWITHOUT) it has more chance to attract students. Instead, the number of railway stations (STATIONS) and the availability of airport (AIRPORTAVAILABILITY) have no significant effect on attractiveness<sup>1</sup>.

Fixed Effects			
	Coeff.	Std. Error	p-value
Quality of life	0,040	0,003	***
Benefit	3,812	1,038	***
CensisQuality	0,037	0,019	
Heterogeneity	1,731	0,703	*
Incidence	0,360	0,080	***
ProvAdWithout	0,243	0,121	*
Airport availability	-0,411	0,320	
Stations	0,003	0,010	
Random Effects			
	Sd	SE	p.value
	1,598	0,103	***
Signif. codes: p<0.000 '***'	p<0.001 '**'	p<0.010 '*' p<0.050 '.'	not sig. ''

#### Table 1: results of the Bradley Terry Model

Table 2 shows the ability scores and rankings for each TETA and academic year, and the improvement index  $I_i$ . To ease comparability, each score is normalized by its range; therefore, the score varies now between 0 (the lowest level of attractiveness) and 1 (the maximum level of attractiveness).

In the time span considered, eight TETAs do not change ranking (for example Bologna, Cosenza and Catania); some strongly improve their position (for example Bolzano, Aosta and Reggio Calabria) while others strongly worsen it (as l'Aquila, Como-Varese and Enna).

Table 3 shows the number of TETAs, the score and the ranking mean (for each academic year) for each macro-area, and the percentage of TETAs that

<sup>&</sup>lt;sup>1</sup> If considered in this model, as the effect is caught by the other covariate.

improve/worsen their attractiveness according to TETAs macro-areas. In the time span, in Centre-North macro-area the ranking mean is higher than South and the score mean in South is lower than Centre-North. Considering improvement in time, the share of TETAs improving their attractiveness in the Centre and North is 46% and 47%, respectively, whereas only 36-37% worsen their position. Instead, among the Southern TETAs those worsening their position prevail (50%).

AQ	TETA					bility Rankir		Improvment
AO		2010-2011	2012-2013	2014-2015	2010-2011	2012-2013	2014-2015	INDEX
	AQUILA	0,6275	0,5964	0,5473	18	19	27	-2,402
COVA	COMO-VARESE	0,5711	0,5607	0,5079	22	24	29	-1,599
EN	ENNA	0,1357	0,0079	0,1357	44	49	47	-1,277
BG	BERGAMO	0,6288	0,5873	0,5730	17	21	25	-0,997
CZ	CATANZARO	0,1685	0,1662	0,1944	43	43	45	-0,338
SA	SALERNO	0,0633	0,0626	0,1219	47	47	49	-0,188
FG	FOGGIA	0,0409	0,0000	0,0000	48	50	50	-0,180
MORE	MODENA-REGGIO EMILIA	0,8139	0,7782	0,7983	6	7	8	-0,081
MC	MACERATA	0,6528	0,6514	0,6587	15	15	16	-0,071
PR	PARMA	0,8354	0,8097	0,8120	3	5	5	-0,066
BA	BARI	0,1928	0,1907	0,2580	36	38	39	-0,044
ISCB	MOLISE	0,1811	0,1841	0,2588	38	40	38	-0,040
UD	UDINE	0,7822	0,7777	0,7930	7	8	10	-0,027
BS	BRESCIA	0,6129	0,5840	0,6074	20	22	20	-0,020
SS	SASSARI	0,4195	0,4171	0,4672	32	33	33	-0,017
TN	TRENTO	0,7763	0,7669	0,7826	8	10	11	-0,016
FR	FROSINONE	0,2200	0,2184	0,2938	35	36	36	-0,014
RM	ROMA	0,7666	0,7530	0,7804	11	12	12	-0,004
VT	VITERBO	0,4475	0,4369	0,4851	29	30	30	-0,003
CA	CAGLIARI	0,4371	0,4292	0,4775	31	32	32	-0,003
CHPE	CHIETI-PESCARA	0,4434	0,4354	0,4807	30	31	31	-0,003
BO	BOLOGNA	1,0000	1,0000	1,0000	1	1	1	0,000
CS	COSENZA	0,1753	0,1776	0,2550	41	41	41	0,000
СТ	CATANIA	0,1686	0,1694	0,2430	42	42	42	0,000
FI	FIRENZE	0,8480	0,8347	0,8518	2	2	2	0,000
PD	PADOVA	0,8216	0,8267	0,8326	4	4	4	0,000
PI	PISA	0,7713	0,7726	0,7957	9	9	9	0,000
TE	TERAMO	0,4096	0,4007	0,4425	34	34	34	0,000
TS	TRIESTE	0,7303	0,7229	0,7739	14	14	14	0,000
PA	PALERMO	0,1343	0,1346	0,2121	45	45	44	0,003
PV	PAVIA	0,5303	0,5217	0,5623	27	27	26	0,003
PU	PESARO-URBINO	0,6507	0,6469	0,6720	16	16	15	0,008
FE	FERRARA	0,5995	0,5927	0,6253	21	20	18	0,010
GE	GENOVA	0,5548	0,5463	0,5851	24	26	22	0,013
ME	MESSINA	0,0365	0,0379	0,1356	49	48	48	0,018
AN	ANCONA	0,5070	0,4936	0,5449	28	29	28	0,023
NA	NAPOLI	0,1798	0,1869	0,2578	40	39	40	0,028
VR	VERONA	0,7568	0,7654	0,7788	12	11	13	0,037
VE VEATNO	VENEZIA PIEMONTE-ORIENTALE	0,6135	0,6115	0,6370	19 23	17	17 23	0,045
		0,5669	0,5577	0,5776	23 39	25 37	23 37	0,111
MTPZ MI	MATERA-POTENZA MILANO	0,1808 0,8154	0,1986 0,8304	0,2932 0,8423	39 5	37	37	0,126 0,140
LE	LECCE	0,8154 0,1296	0,8304	0,8425	5 46	3 44	43	0,140
PG	PERUGIA	0,1296	0,1561	0,2369	46 26	23	43 21	0,185
TO	TORINO	0,5504	0,5820	0,5884 0,8064	26 10	6	6	0,255
BN	BENEVENTO	0,7670	0,7806	0,8084	37	35	35	0,265
SI	SIENA	0,1903	0,2430	0,3080	13	13	33 7	0,514
RC	REGGIOCALABRIA	0,7338	0,0757	0,1995	50	46	46	0,826
AO	AOSTA	0,5511	0,6063	0,6234	25	18	19	1,114
BZ	BOLZANO	0,3311	0,5197	0,5768	33	28	24	1,685

 Table 2: ability scores and rankings, improvement index

	North	Centre	South	
Number of TETA	19	11	20	
Mean score 10/11	0,6943	0,6110	0,2157	
Mean score 12/13	0,6916	0,6116	0,2136	
Mean score 14/15	0,7091	0,6449	0,2738	
/Iean ranking 10/11	15	19	40	
Mean ranking 12/13	15	18	40	
Mean ranking 14/15	15	18	40	
Improvement				
-	37%	36%	50%	
=	16%	18%	15%	
+	47%	46%	35%	
Total	100%	100%	100%	

Table 3: descriptive statistics and improvement index by macro-area

#### 4 Conclusions

The results of the Bradley-Terry model suggest that TETAs attractiveness does not depend only on the quality of the educational supply, but also on socio-economic factors reflecting the well-known divide between the less-advanced Southern and the more-advanced Northern regions. These economic factors affect the behaviour of individuals and the decisions of families, who tend to migrate toward the Northern regions for tertiary studies to look for better educational and job opportunities. Furthermore, TETAs that are able to attract students from adjacent provinces without universities and with higher initial advantage are more attractive than the others. Regarding the time span considered, some TETAs improve their attractiveness whereas other get worse (in a more or less considerable way), and eight TETAs do not change their capability to attract students. Among them, Bologna maintains its first position. According to the empirical findings, most of the Southern TETAs were the least attractive areas: the first Southern TETAs, at the beginning of the period, is in 18-th position whilst the last Northern TETA is in 33th position in ranking. This is the notorious North-South divide that (with some exceptions) is confirmed in time: about half of Southern TETAs lost attractiveness, and, considering all TETAs, the 20% of TETAs that lose attractiveness is in the South, against the lowest 14% for the Northern TETAs and 8% for the Centre macro-area.

#### **5** Citations and References

- Agarwal, P., Said M.E., Sehoole, M.T., Sirozi, M., and De Wit, H. (2008). The Dynamics of International Student Circulation in a Global Context: Summary, Conclusions and Recommendations. In De Wit, Agarwal P., Said M.E., Sehoole M.T. and Sirozi M., (eds.), *The Dynamics of International Student Circulation in a Global Context*, 233-261. Rotterdam: Sense Publishers
- Agasisti, T., and Dal Bianco, A. (2007). Determinants of college student migration in Italy: Empirical evidence from a gravity approach. Congress of the European Regional Science Association, 1-14
- 3. Agresti, A. (2002). Categorical Data Analysis. New York: Wiley.
- 4. Baryla, E. A., and Dotterweich, D. (2001). Student Migration: Do Significant Factors Vary by Region? *Education Economics*, 9, 3, 269-280
- 5. Beine, M., Romain N., and Ragot, L., (2012). The Determinants of International Mobility of Students, *CESifo* Working Paper Series n. 3848, CESifo Group Munich.
- 6. Bradley, R. A., and Terry, M. E. (1952), The rank analysis of incomplete block designs. The method of paired comparisons. *Biometrika*, 39, 324–345
- Brunello, G., and Cappellari, L. (2005). The Labour Market Effect of Alma Mater. IZA Discussion Paper Series, 1562, 1-36
- Ciriaci, D., and Nuzzi, A. (2012). Qualità dell'Università e mobilità dei laureati italiani: evidenze empiriche e proposte di policy. *Istituzioni del federalismo: rivista di studi giuridici e politici*, 2, 363–398
- Caruso, R., and de Wit, H. (2013). Determinants of Mobility of Students in Europe: a preliminary quantitative study. *Munich Personal RePEc Archivi MPRA n.* 49808, 1-25
- Dal Bianco, A., Spairani, A., and Ricciari, V. (2009). La mobilità degli studenti in Italia: un 'analisi empirica, *Rivista di Economia e statistica del Territorio*, 1, 123-143
- De Wit, H. (2008). Changing Dynamics in International Student Circulation: Meanings, Push and Pull factors, trends and Data. In De Wit, Agarwal P., Said M.E., Sehoole M.T. and Sirozi M., (eds.), The Dynamics of International Student Circulation in a Global Context. pp. 15-46. Sense Publishers, Rotterdam.
- Dotti, N. F, Fratesi, U., Lenzi, C., and Percoco, M. (2013). Local Labour Markets and the Interregional Mobility of Italian University Students. *Spatial Economic Analysis*, 8, 4, 443-468
- 13. Fratesi, U., and Percoco, M. (2014). Selective migration, regional growth and convergence: Evidence from Italy, *Regional Studies*, forthcoming.
- Fratesi, U., and Riggi, M. R. (2007). Does migration reduce regional disparities? The role of skillselective flows, *Review of Urban and Regional Development Studies*, 19, 1, 78–102.
- Giambona F., Vassallo E., (2013), Composite Indicator of Social Inclusion for European Countries, Social Indicators Research, Springer, 116, 1, 269-293, ISSN: 0303-8300
- 16. Giambona F., Porcu M., Sulis I., Students mobility: assessing the determinants of attractiveness across competing territorial areas, *forthcoming*.
- 17. Kahanec, M., and Kralikova, R. (2011). Pulls of International Student Mobility. *IZA Discussion Paper*, n. 6233, 1-18.
- Kratz, F. (2011). Is spatial mobility a reproduction mechanism of inequality? *Alma Laurea working papers*, n. 26, 1-16.
- 19. Lupi, C. and Ordine, P. (2008). Family Income and Students' Mobility. *Economics & Statistics Discussion Paper*, 47, 1-22.
- Makovec, M. (2006). Does it Pay to Study Far from Home? Explaining the Returns to Geographic Mobility of Italian College Graduate. *European Association of Labour Economics Annual Conference*, Prague.
- 21. Ordine, P., and Rose, G. (2007). The Supply of Education Quality in a Spatial Model with Asymmetric Moving Costs. *Latin American Econometric Society Annual Meeting*, Bogotà.
- 22. Svimez. (2009). Rapporto sull'economia del Mezzogiorno, Bologna, Il Mulino.
- Turner, H. & Firth, D. (2012). Bradley-Terry models in R: The BradleyTerry2 package. Journal of Statistical Software, 48, 9, 1–21.
- 24. Van Bouwel, L., and Veugelers, R. (2013). The determinants of student mobility in Europe: the quality dimension. *European Journal of Higher Education*, 3, 2, 172-190

25. Viesti, G. (2005). Nuove migrazioni. Il 'trasferimento' di forza lavoro giovane e qualificata dal Sud al Nord, *Rivista Bimestrale di cultura e di politica*, 4, 678–688.