

**SIS** | 2022

51st Scientific Meeting of the Italian Statistical Society

Caserta, 22-24 June









## Book of the Short Papers

Editors: Antonio Balzanella, Matilde Bini, Carlo Cavicchia, Rosanna Verde



















Matilde Bini (Chair of the Program Committee) - *Università Europea di Roma* Rosanna Verde (Chair of the Local Organizing Committee) - *Università della Campania "Luigi Vanvitelli"* 

### PROGRAM COMMITTEE

Matilde Bini (Chair), Giovanna Boccuzzo, Antonio Canale, Maurizio Carpita, Carlo Cavicchia, Claudio Conversano, Fabio Crescenzi, Domenico De Stefano, Lara Fontanella, Ornella Giambalvo, Gabriella Grassia - Università degli Studi di Napoli Federico II, Tiziana Laureti, Caterina Liberati, Lucio Masserini, Cira Perna, Pier Francesco Perri, Elena Pirani, Gennaro Punzo, Emanuele Raffinetti, Matteo Ruggiero, Salvatore Strozza, Rosanna Verde, Donatella Vicari.

#### LOCAL ORGANIZING COMMITTEE

Rosanna Verde (Chair), Antonio Balzanella, Ida Camminatiello, Lelio Campanile, Stefania Capecchi, Andrea Diana, Michele Gallo, Giuseppe Giordano, Ferdinando Grillo, Mauro Iacono, Antonio Irpino, Rosaria Lombardo, Michele Mastroianni, Fabrizio Maturo, Fiammetta Marulli, Paolo Mazzocchi, Marco Menale, Giuseppe Pandolfi, Antonella Rocca, Elvira Romano, Biagio Simonetti.

### ORGANIZERS OF SPECIALIZED, SOLICITED, AND GUEST SESSIONS

Arianna Agosto, Raffaele Argiento, Massimo Aria, Rossella Berni, Rosalia Castellano, Marta Catalano, Paola Cerchiello, Francesco Maria Chelli, Enrico Ciavolino, Pier Luigi Conti, Lisa Crosato, Marusca De Castris, Giovanni De Luca, Enrico Di Bella, Daniele Durante, Maria Rosaria Ferrante, Francesca Fortuna, Giuseppe Gabrielli, Stefania Galimberti, Francesca Giambona, Francesca Greselin, Elena Grimaccia, Raffaele Guetto, Rosalba Ignaccolo, Giovanna Jona Lasinio, Eugenio Lippiello, Rosaria Lombardo, Marica Manisera, Daniela Marella, Michelangelo Misuraca, Alessia Naccarato, Alessio Pollice, Giancarlo Ragozini, Giuseppe Luca Romagnoli, Alessandra Righi, Cecilia Tomassini, Arjuna Tuzzi, Simone Vantini, Agnese Vitali, Giorgia Zaccaria.

### ADDITIONAL COLLABORATORS TO THE REVIEWING ACTIVITIES

Ilaria Lucrezia Amerise, Ilaria Benedetti, Andrea Bucci, Annalisa Busetta, Francesca Condino, Anthony Cossari, Paolo Carmelo Cozzucoli, Simone Di Zio, Paolo Giudici, Antonio Irpino, Fabrizio Maturo, Elvira Romano, Annalina Sarra, Alessandro Spelta, Manuela Stranges, Pasquale Valentini, Giorgia Zaccaria.

Copyright © 2022

PUBLISHED BY PEARSON

WWW.PEARSON.COM

ISBN 9788891932310

# Contents

Preface	XVII
1 Plenary Sessions	1
Causal inference in air pollution epidemiology  Francesca Dominici	2
Clustering of Attribute Data and Network  Anuška Ferligoj	11
Bayesian approaches for capturing the heterogeneity of neuroimaging experiments  Francesco Denti, Laura D'Angelo and Michele Guindani	17
2 Specialized Sessions	30
Advances in Bayesian nonparametric methodology	31
Repulsive mixture models for high-dimensional data Lorenzo Ghilotti, Mario Beraha and Alessandra Guglielmi	32
Bayesian nonparametric mixtures of directed acyclic graph models Federico Castelletti and Guido Consonni	37
Bayesian Clustering of Brain Regions via Extended Stochastic Block Models Sirio Legramanti, Tommaso Rigon and Daniele Durante	45
Data Science skills for next generation statisticians	52
Cluster based oversampling for imbalanced learning Gioia Di Credico and Nicola Torellii	53
Estimating the effect of remote teaching for university students through generalised linear mixed models  Silvia Bacci, Bruno Bertaccini, Simone Del Sarto, Leonardo Grilli and Carla Rampichini	65
Perceived stress across EU countries: does working from home impact?  Stefania Canecchi. Francesca Di India and Nunzia Nappo	71

statisticians	77
Investigating effect of air pollution on health via Spatial-Resolution Varying Coefficient Models Garritt L. Page and Massimo Ventrucci	78
A statistical framework for evaluating health effect of PM sources  Monica Pirani, Georges Bucyibaruta, Gary Fuller, David Green, Anja Tremper, Christina Mitsakou and Marta Blangiardo	84
Adjusting for unmeasured spatial confounding through shrinkage methods  Pasquale Valentini, Alexandra M. Schmidt, Carlo Zaccardi and Luigi Ippoliti	91
Explainable Artificial Intelligence methods	98
Multidimensional Time Series Analysis via Bayesian Matrix Auto Regression Alessandro Celani and Paolo Pagnottoni	99
Advances in Classification and Data Analysis	109
Optimizing time slots in scientific meetings: a Latent Dirichlet allocation approach	110
Clustering artists based on the energy distributions of their songs on Spotify via the Common Atoms Model  Francesco Denti, Federico Camerlenghi, Michele Guindani and Antonietta Mira	121
Hidden markov models for four-way data Salvatore D. Tomarchio, Antonio Punzo and Antonello Maruotti	127
Family demography	133
Does family of origin make the difference in occupational outcomes?  Annalisa Busetta, Elena Fabrizi, Isabella Sulis and Giancarlo Ragozini	134
Is there a cultural driver pushing Italian low fertility?  Francesca Luppi, Alessandro Rosina and Maria Rita Testa	144
Unpaid family work and the subjective well-being of Italian women during lockdown  Marina Zannella, Erica Aloé, Marcella Corsi and Alessandra de Rose	155
New Frontiers in the theory of composite indicators	164
Methodological PLS-PM Framework for Model Based Composite Indicators  Rosanna Cataldo	165
Open issues in composite indicators construction  Leonardo Salvatore Alaimo	176
The posetic approach to the construction of socio-economic indicators: open issues and research opportunities	186

Advances in complex sampling strategies	197
Random forest model-assisted estimation for finite population totals  Mehdi Dagdoug, Camelia Goga and David Haziza	198
Design-based consistency of the Horvitz-Thompson estimator in spatial sampling  Lorenzo Fattorini	208
The responsive-adaptive survey design approach for planning the permanent census of population and housing  Claudia De Vitiis, Stefano Falorsi, Alessio Guandalini, Francesca Inglese, Paolo Righi and Marco D. Terribili	216
Socio-demographic aspects of aging in Italy	228
Socio-economic and spatial stratification of frailty in the older population  Margherita Silan	229
Time allocation and wellbeing in later life: the case of Italy  Annalisa Donno and Maria Letizia Tanturri	241
The role played by migration and fertility on Italy's demographic aging trends: a provincial-level analysis  Thais García-Pereiro and Anna Paterno	250
New challenges in the labour market	260
Detecting changes and evolution in specialized professional figures: an application on the Italian IT & Digital sector	261
How did the COVID-19 pandemic affect the genderpay gap in EU countries?  Antonella Rocca, Paolo Mazzocchi, Giovanni De Luca, Rosalia Castellano and Claudio Quintano	272
Skill Similarities and Dissimilarities in Online Job Vacancy Data across Italian Regions Adham Kahlawi, Lucia Buzzigoli, Laura Grassini and Cristina Martelli	284
Small area estimation methods with socioeconomic applications	292
Exploring Small Area Estimation techniques to address uncertainty in Spatial Price Indexes    Ilaria Benedetti and Federico Crescenzi	293
Small Area Estimation of Relative Inequality Indices using Mixture of Beta  Silvia De Nicolò and Silvia Pacei	301
Inference for big data assisted by small area methods: an application to OBEC (on-line based enterprise characteristics)  Monica Pratesi, Francesco Schirripa Spagnolo, Gaia Bertarelli, Stefano Marchetti, Monica Scannapieco, Nicola Salvati and Donato Summa	305

Statistical methods and models for Sports Analytics	312
The 'hot shoe' in soccer penalty shootouts  Andreas Groll and Marius Otting	313
G-RAPM: revisiting player contributions in regularized adjusted plus-minus models forbasketball analytics  Luca Grassetti	319
Formative vs Reflective constructs: a CTA-PLS approach on a goalkeepers' performance model  Mattia Cefis and Eugenio Brentari	323
Integrating available Data Sources for Official Statistics	329
The Use of Administrative Data for the Estimation of Italian Usually Resident Population  Marco Caputi, Giampaolo De Matteis, Gerardo Gallo and Donatella Zindato	330
New frontiers for the analysis of the territorial economic phenomena	339
An empirical tool to classify industries by regional concentration and spatial polarization  Diego Giuliani, Maria Michela Dickson, Flavio Santi and Giuseppe Espa	340
Comparing non-compensatory composite indicators: a case study based on SDG for Mediterranean countries  Francesca Mariani, Mariateresa Ciommi, Maria Cristina Recchioni, Giuseppe Ricciardo Lamonica and Francesco Maria Chelli	346
Evaluating the determinants of innovation from a spatio-temporal perspective. The GWPR approach  Gaetano Musella, Giorgia Rivieccio and Emma Bruno	354
Dimension Reduction for complex data	366
Discrimination and clustering via principal components  Nikolay Trendafilov and Violetta Simonacci	367
Exploratory graph analysis for configural invariance assessment  Sara Fontanella, Alex Cucco and Nicola Pronello	373
Penalized likelihood factor analysis  Kei Hirose	379

3 Solicited Sessions	385
Bayesian nonparametric modelling and learning	386
A regularized-entropy estimator to enhance cluster interp in Bayesian nonparametrics Beatrice Franzolini and Giovanni Rebaudo	oretability 387
Exact confidence sets from credible sets with finite amount Bas J. K. Kleijn	nts of data 399
Empirical Bayesian analysis of componentwise maxima in multivariate samples  Simone A. Padoan and Stefano Rizzelli	411
Processing of textual data in large corpora	420
Predictive performance comparisons of different feature emethods in a financial column corpus  Andrea Sciandra and Riccardo Ferretti	extraction 421
Topics and trends in the End-of-Year addresses of the Pre of the Italian Republic (1949-2021)	esidents 428
Thematic analysis on online education issues during COVI Valerio Basile, Michelangelo Misuraca and Maria Spano	ID-19 437
What do we learn by applying multiple methods in topic do A comparative analysis on a large online dataset about electrification  Fabrizio Alboni, Margherita Russo and Pasquale Pavone	
Businesses in industry: new challenges in sustainability innovation, performance and competitiveness	/, 454
Multidimensional assessment of Eco-Innovation and its lin Marketing Innovations Ida D'Attoma and Marco leva	ık with 455
Circular Economy practices in the European SMEs: comp and country-level drivers Francesca Bassi, Josè G. Dias and Nunzio Tritto	any-level 462
The employment effects of Italian Jobs Act. An ex-post imevaluation  Alessandro Zeli and Leopoldo Nascia	npact 474
Statistics for finance: new models, new data	482
The News-Jumps Relationship in the Cryptocurrency Mar Ahmet Faruk Aysan, Massimiliano Caporin, Oguzhan Cepni, and Francesco Poli	rket 483
A weighted quantile approach to Expected Shortfall forec	asting 489

Smooth and abrupt dynamics in financial volatility: the MS-MEM-MIDAS Giampiero M. Gallo, Edoardo Otranto and Luca Scaffidi Domianello	492
The tail index and related quantities for volatility models  Fabrizio Laurini	501
Bayesian inference for complex random structures	507
Bayesian nonparametric modeling of mortality curves via functional Dirichlet processes  Emanuele Aliverti and Bruno Scarpa	508
Bayesian nonparametric clustering of spatially-referenced spike train data  Laura D'Angelo	514
Bayesian Analysis of Mortality in Iceland via Locally Adaptive Splines  Federico Pavone and Sirio Legramanti	520
Advances in clustering	526
A Two-step Latent Class Approach with Measurement Equivalence Testing  Zsuzsa Bakk, Roberto Di Mari, Jennifer Oser and Marc Hooghe	527
Group-wise penalized estimation schemes in model-based clustering  Alessandro Casa, Andrea Cappozzo and Michael Fop	534
Extending finite mixtures of latent trait analyzers for bipartite networks  Dalila Failli, Maria Francesca Marino and Francesca Martella	540
A Fast Majorization-Minimization Algorithm for Convex Clustering  Daniel J.W. Touw, Patrick J.F. Groenen and Yoshikazu Terada	551
Statistical Methods for Complex Evolutionary Data	558
A FANOVA model with repeated measures for detecting patterns in biomechanical data  Ana M. Aguilera, Christian Acal and Manuel Escabias	559
Modes of variation for Lorenz curves  Enea G. Bongiorno and Aldo Goia	565
Analyzing textual data through Word Embedding: experiences in Istat Mauro Bruno, Elena Catanese, Massimo De Cubellis, Fabrizio De Fausti, Francesco Pugliese, Monica Scannapieco and Luca Valentino	571
Functional Horvitz-Thompson estimator for convex curves  Adelia Evangelista, Francesca Fortuna, Stefano Antonio Gattone and Tonio Di Battista	584

Children, parents, grandparents: a look on changing relationships	590
Changes in social relationships of Italian older people. Evidence from FSS and SHARE Corona surveys  Elvira Pelle, Giulia Rivellini and Susanna Zaccarin	591
Internet use and contacts with children among older Europeans Bruno Arpino	600
A time-based comparative approach to study the changing demography of grandparenthood in Italy  ***Elisa Cisotto, Eleonora Meli and Giulia Cavrini	607
Carry that weight: Parental separation and children's Body Mass Index from childhood to young adulthood	616
Living conditions, well-being and poverty	622
Analyzing the impact of COVID-19 pandemic on elderly population well-being  Gloria Polinesi, Mariateresa Ciommi and Chiara Gigliarano	623
Exploring sustainable food purchasing behaviour using Italian scanner data  Ilaria Benedetti, Alessandro Brunetti, Federico Crescenzi and Luigi Palumbo	629
The evaluation of heat vulnerability in Friuli-Venezia Giulia  Laura Pagani, Maria Chiara Zanarotti and Anja Habus	635
Data Science for Functional and Complex Data	641
A parsimonious approach to representing functional  Enea G. Bongiomo and Aldo Goia	642
Mixed-effects high-dimensional multivariate regression via group-lasso regularization  Francesca leva, Andrea Cappozzo, and Giovanni Fiorito	648
The integration of immigrants in Italy: a multidimensional perspective	654
Albanian, Romanian and Italian women's fertility intentions: a comparative perspective among migrants, stayers and natives  Thais García-Pereiro and Anna Paterno	655
Does self-employment in the origin-country affect self-employment after migration? Evidence from Italy and Spain  Floriane Bolazzi and Ivana Fellini	662
The impact of integration on immigrants' health behaviours in Italy Giovanni Minchio, Raffaella Rusciani and Teresa Spadea	675
Migration, gender, and the distribution of paid and unpaid labour. Preliminary perspectives on foreign couples in Italy Rocco Molinari, Agnese Vitali and Ester Gallo	687

Sampling techniques for big data analysis	695
Non-probability samples and big data: how to use them?  Pier Luigi Conti	696
Combining Big Data with probability survey data: a comparison of methodologies for estimation from non-probability surveys  Maria del Mar Rueda, Ramn Ferri-Garcia and Luis Castro-Martin	707
A Bayesian approach for combining probability and non-probability samples surveys  Camilla Salvatore, Silvia Biffignandi, Joseph Sakshaug, Bella Struminskaya and Arkadiusz Wisniowski	717
Big data and Official Statistics: some evidences Paolo Righi, Natalia Golini and Gianpiero Bianchi	723
The analysis of students performance and behaviour based on large databases	735
Students enrolled in STEM discipline in Italy: patterns of retention, dropout and switch  Valentina Tocchioni, Carla Galluccio, Maria Francesca Morabito and Alessandra Petrucci	736
The routes of Southern Italy University students: an explorative analysis  Gabriele Ruiu and Vincenzo Giuseppe Genova	747
A new bipartite matching approach for record linkage: the case of two big Italian databases  Martina Vittorietti, Andrea Priulla, Vincenzo Giuseppe Genova, Giovanni Boscaino and Ornella Giambalvo	754
Statistical Methods for Science Mapping	761
A word embedding strategy to study the thematic evolution of ageing and healthcare expenditure growth literature  Milena Lopreite, Michelangelo Misuraca and Michelangelo Puliga	762
An automatic approach for bibliographical co-words networks labelling  Manuel J. Cobo and Maria Spano	773
Characterising research areas in the field of Al Alessandra Belfiore, Angelo Salatino and Francesco Osborne	780
Mapping evolutionary paths of a society: the longitudinal analysis of the Italian Economia Aziendale  Corrado Cuccurullo, Luca D'Aniello and Michele Pizzo	786
Modelling complex structures in ecological data	793
New insights on the ecology and conservation of Mediterranean sharks through the development of Citizen Science networks and new modeling approaches  Stefano Moro, Francesco Ferretti, Francesco Colloca	794

Southern Italian municipalities  Crescenza Calculli and Serena Arima	798
Assessment of the impact of anthropic pressures on the Giglio island meadow of Posidonia oceanica  Gianluca Mastrantonio, Daniele Ventura, Gianluca Mancini and Giandomenico Ardizzone	804
Accounting for observation processes in spatio-temporal ecological data  Janine Illian	811
Statistics and indicators for the recovery and resilience plan	815
The prominence of statistical information for the monitoring and effective implementation of the NRRP	816
Big Data Analytics in mobile cellular networks as enabler for innovative statistics to evaluate the effects of Recovery and Resilience Plan actions  Andrea Zaramella, Dario Di Sorte, Denis Cappellari and Bruno Zamengo	819
Measuring the digital transition within the PA: proposals comparison Susanna Traversa and Enrico Ivaldi	823
Guest Session - European Network for Business and Industrial Statistics (ENBIS)	828
Interpretability in functional clustering with an application to resistance spot welding process in the automotive industry Christian Capezza, Fabio Centofanti, Antonio Lepore and Biagio Palumbo	829
Statistical process monitoring of thermal images in additive manufacturing: a nonparametric solution for in-situ monitoring  Panagiotis Tsiamyrtzis, Marco Luigi Giuseppe Grasso and Bianca Maria Colosimo	835
Guest Session - International Biometric Society (IBS) - Italian region	837
Multiple arrows in the Bayesian quiver: Bayesian learning of partially directed structures from heterogeneous data  Luca La Rocca, Federico Castelletti, Stefano Peluso, Francesco Claudio Stingo and Guido Consonni	838

4 Contributed Sessions	844
Applications in Machine Learning	845
A neural network approach to survival analysis with time-dependent covariates for modelling time to cardiovascular diseases in HIV patients  Federica Corso, Agostino Lurani Cernuschi, Laura Galli, Chiara Masci, Camilla Muccini, Anna Maria Paganoni and Francesca	846
leva	
Analyzing the Correlation Structure of Financial Markets Using a Quantile Graphical Model  Beatrice Foroni, Luca Merlo and Lea Petrella	852
Neural Network for statistical process control of a multiple stream binomial process with an application to HVAC systems in passenger rail vehicles  Gianluca Sposito, Antonio Lepore, Biagio Palumbo and Giuseppe Giannini	858
Sparse signal extraction via variational SVM Cristian Castiglione and Mauro Bernardi	864
Bayesian modelling and inference 1	870
Bayesian Inference for the Multinomial Probit Model under Gaussian Prior Distribution Augusto Fasano, Giovanni Rebaudo and Niccolo Anceschi	871
Mapping Indicators on the Unit Interval: the tipsae Shiny App Silvia De Nicolò and Aldo Gardini	877
A Bayesian spatio-temporal model of PM10 pollutant in the Po Valley Matteo Gianella, Alessandra Guglielmi and Giovanni Lonati	/ 883
Construction if a proper prior for a Bayesian envelope model  Andrea Mascaretti	889
Hilbert principal component regression for bimodal bounded responses  Enea G. Bongiorno, Agnese M. Di Brisco, Aldo Goia, and Sonia Migliorati	895
Methods of causal inference	901
Bayesian causal mediation analysis through linear mixed-effect models  Chiara Di Maria, Antonino Abbruzzo and Gianfranco Lovison	902
Bootstrap-aggregated adjustment set selection  Lorenzo Giammei	908
Exploiting partial knowledge to evaluate the average causal effect via an ABC perspective  Giulia Cereda, Fabio Corradi and Cecilia Viscardi	914

application to covid-19 lockdowns and air pollution in Northern Italy  Daniele Bondonio and Paolo Chirico	920
Methods for Spatio-temporal data	926
Local Spatio-Temporal Log-Gaussian Cox Processes for seismic data analysis  Nicoletta D'Angelo, Giada Adelfio, and Jorge Mateu	927
Spatial explorative analysis of thyroid cancer in Sicilian volcanic areas  Francesca Bitonti and Angelo Mazza	933
Using geo-spatial topic modelling to understand the public view of Italian Twitter users: a climate change application  Yuri Calleo and Francesco Pilla	939
Comparing local structures of spatio-temporal point processes on linear networks  Nicoletta D'Angelo, Giada Adelfio, and Jorge Mateu	945
DISTATIS-based spatio-temporal clustering approach: an application to business cycles' time series  Raffaele Mattera and Germana Scepi	951
Developments in composite indicators	957
Bayesian Networks for monitoring the gender gap Flaminia Musella, Lorenzo Giammei, Silvana Romio, Fulvia Mecatti and Paola Vicard	958
An Alternative Aggregation Function for the UNDP Human Development Index Manuela Scioni and Paola Annoni	964
An ultrametric model for building a composite indicator system to study climate change in European countries  Giorgia Zaccaria and Pasquale Sarnacchiaro	970
Functional Weighted Malmquist Productive Index: a proposal for a dynamic composite indicator  Annalina Sarra, Eugenia Nissi and Tonio Di Battista	975
CFA & PLS-PM for UX-AI Product infused  Emma Zavarrone and Rosanna Cataldo	981
Fertility, adulthood, and economic uncertainty	987
Uncertainty and fertility intentions: a comparison between the Great Recession and the Covid-19 crisis Chiara Ludovica Comolli	988
Interpreting the relationship between life course trajectories and explanatory factors. An example on the transition to adulthood  Danilo Bolano, Matthias Studer and Reto Buergin	996

The relationship between economic news and fertility: the case of Germany  Maria Francesca Morabito, Raffaele Guetto, Matthias Vollbracht and Daniele Vignoli	1002
Leaving home among Millennials in Italy: does economic uncertainty matter?  Silvia Meggiolaro and Fausta Ongaro	1008
Adverse pregnancy outcomes in The United Kingdom following unexpected job loss  Alessandro Di Nallo and Selin Koksal	1014
Bayesian modelling and inference 2	1020
A Bayesian beta linear model to analyze fuzzy rating responses  Antonio Calcagnì, Massimiliano Pastore, Gianmarco Altoe and Livio Finos	1021
A Mixture Model for Multi-Source Cyber-Vulnerability Assessment Mario Angelelli, Serena Arima and Christian Catalano	1028
Hierarchical Bayesian models for analysing fish biomass data Rita Fici, Antonino Abbruzzo, Luigi Augugliaro and Giacomo Milisenda	1034
Insights into the derivative-based method for nonlinear mediation models  Claudio Rubino and Chiara Di Maria	1040
An exploration of Approximate Bayesian Computation (ABC) and dissimilarities  Laura Bondi, Marco Bonetti and Raffaella Piccarreta	1046
Advances in Categorical and Preference data	1052
On the predictability of a class of ordinal data models  Rosaria Simone and Domenico Piccolo	1053
Multivariate analysis of binary ordinal data using graphical models  Camilla Caroni, Fabio Alberto Comazzi, Andrea Deretti and Federico Castelletti	1059
Multinomial Thompson Sampling for adaptive experiments with rating scales	1065
Ranking extraction in nested partially ordered data systems  Marco Fattore, Barbara Cavalletti, Matteo Corsi and Alessandro Avellone	1071
Towards the definition of distance measures in the preference- approval structures  Alessandro Albano, Mariangela Sciandra and Antonella Plaia	1077
Covid-19 Assessment and Evaluation 1	1083
Covid-19 impact assessment and inequality decomposition methods  Federico Attili and Michele Costa	s 1084

Multiversal methods for model selection: COVID-19 vaccine coverage and relative risk reduction  Venera Tomaselli and Giulio Giacomo Cantone	1090
Efficiency and feasibility of two stage sampling designs for estimating SARS-CoV-2 epidemic  Pietro Demetrio Falorsi, Vincenzo Nardelli and Giuseppe Arbia	1096
Evaluating the impacts of Covid-19 on the overall Italian death process via Functional Data Analysis  Riccardo Scimone, Alessandra Menafoglio, Laura M. Sangalli and Piercesare Secchi	1102
Developing countries, migration and migrants	1107
Domestic violence in Africa: a glance through the DHS survey  Micaela Arcaio, Daria Mendola and Anna Maria Parroco	1108
Inequalities in undernutrition among Roma and non-Roma children in Western Balkans: an analysis of the determinants  Annalisa Busetta, Valeria Cetorelli and Chiara Puglisi	1114
The manual, communicative and quantitative abilities of native and foreign workers according to their level of education in Italy  Camilla Pangallo, Oliviero Casacchia and Corrado Polli	1120
HIV Prevalence in some African Territories: Socio-Economic Drivers  Micaela Arcaio, Daria Mendola and Anna Maria Parroco	1126
A longitudinal cross country comparison of migrant integration policies via Mixture of Matrix-Normals  Leonardo Salvatore Alaimo, Francesco Amato and Emiliano Seri	1132
Education and job placement	1138
Measuring happiness at work with categorical Principal Component Analysis Ulpiana Kocollari, Maddalena Cavicchioli and Fabio Demaria	1139
Early and accurate: a Machine Learning approach to predict students' final outcome with registry data  Lidia Rossi, Marta Cannistrà and Tommaso Agasisti	1146
Students' experience with distance learning during Covid 19 pandemic in Southern Italy  Angela Maria D'Uggento and Nunziata Ribecco	1153
Time series methods and Applications	1159
Trend and cycle decomposition in nonlinear time series  Maddalena Cavicchioli	1160
Asymptotic properties of the SETAR parameters: a new approach	1166
Food prices forecast using post-sampled crowdsourced data with Reg-ARMA model: the case of Nigeria	1172

Universal change point testing for dependent data Federica Spoto, Alessia Caponera and Pierpaolo Brutti	1178
Change point detection in fruit bioimpedance using a three-way panel model  F. Marta L. Di Lascio and Selene Perazzini	1184
Bayesian modelling and inference 3	1190
A dynamic power prior approach to non-inferiority trials for normal means with unknown variance  Francesco Mariani, Fulvio De Santis and Stefania Gubbiotti	1191
Bayesian Change-Point Detection for a Brownian Motion with a Total Miss Criterion  Bruno Buonaguidi	1197
On the comparison of alternative Bayesian measures of posterior discrepancy  Fulvio De Santis and Stefania Gubbiotti	1203
A Bayesian Test for the comparison of two independent populations  Mara Manca, Silvia Columbu and Monica Musio	1209
A contribution to the L. J. Savage problem  Francesco Bertolino, Silvia Columbu and Mara Manca	1215
Methods for Complex Data	1221
Optimization of delayed rejection adaptive metropolis  Daniele Raffo and Antonietta Mira	1222
Dealing with multicollinearity and outliers in multinomial logit model: a simulation study Ida Camminatiello and Antonio Lucadamo	1228
A tool to validate the assumptions on ratios of nearest neighbors' distances: the Consecutive Ratio Paths  Francesco Denti and Antonietta Mira	1233
Dimensionality reduction and visualization for interval-valued data via midpoints-ranges principal component analysis  Viviana Schisa, Alfonso Iodice D'Enza and Francesco Palumbo	1239
Data-driven design-based mapping of forest resources Sara Franceschi, Rosa Maria Di Biase, Lorenzo Fattorini, Marzia Marcheselli and Caterina Pisani	1245
Environmental data and Climate change	1252
Ensemble model output statistics for temperature forecasts in Veneto  Gaetan Carlo, Giummole Federica, Mameli Valentina and Siad Si Mokrane	1253
State of the urban Environment in Italy. A comparative analysis of selected composite indicators	1259

A Functional Data Analysis approach for Climate Model Selection: the case study of Campania Region  Veronica Villani, Elvira Romano and Paola Mercogliano	1266
Evolution of scientific literature on climate change: a bibliometric analysis  Gianpaolo Zammarchi, Giulia Contu, Maurizio Romano	1273
Energy and material demand of the Italian Regions Flora Fullone, Giulia Iorio, Assunta Lisa Carulli	1279
Health and survivorship	1285
Increasing Inequalities in Mortality by Socioeconomic Position in Italy Chiara Ardito, Nicolás Zengarini, Roberto Leombruni, Angelo d'Errico and Giuseppe Costa	1286
The role of health conditions in the relationship between socio- economic status and well-being: the counterfactual approach in mediation models  Sara Manzella and Margherita Silan	1296
Excess economic burden of multimorbidity: a population-based study in Italy  Chiara Seghieri, Niccolò Borri, Gaia Bertarelli and Sabina Nuti	1302
Depression-free life expectancy among 50 and older Americans by gender, race/ethnicity and education: the effect of marital disruption  Alessandro Feraldi and Cristina Giudici	1308
Disability-free grandparenthood in Italy. Trends and gender differences  Margherita Moretti, Elisa Cisotto and Alessandra De Rose	1314
Advances in regression models	1320
Semiparametric M-quantile regression for modelling georeferenced housing price data  Riccardo Borgoni, Antonella Carcagni, Alessandra Michelangeli, Nicola Salvati and Francesco Schirripa Spagnolo	1321
Resampling-based inference for high-dimensional regression  Anna Vesel, Jelle J. Goeman, Angela Andreella and Livio Finos	1327
Quantile regression coefficient modeling for counts to evaluate the productivity of university students  Viviana Carcaiso and Leonardo Grilli	1333
Adaptive smoothing spline using non-convex penalties  Daniele Cuntrera and Vito M.R. Muggeo	1339
Conditional tests for generalized linear models  Riccardo De Santis, Jelle J. Goeman, Anna Vesely and Livio Finos	1345

Methods and applications in economics and finance	1351
Mixed models for anomaly detection in anti-money laundering aggregate reports  Stefano lezzi and Marianna Siino	1352
On the drivers of Greenwashing risk: evidence from Eurostoxx600  Yana Kostiuk, Costanza Bosone and Paola Cerchiello	1358
Modelling Financial Returns with Finite Mixtures of GED  Pierdomenico Duttilo and Stefano Antonio Gattone	1364
Risk Parity strategy for portfolio construction: a kurtosis-based approach  Maria Debora Braga, Consuelo Rubina Nava and Maria Grazia Zoia	1370
Fully reconciled probabilistic GDP forecasts from Income and Expenditure sides  Tommaso Di Fonzo and Daniele Girolimetto	1376
Latent Class models	1382
Latent thresholds model in classification tasks Giuseppe Mignemi, Andrea Spoto and Antonio Calcagnì	1383
Adaptive filters for time-varying correlation parameters  Michele Lambardi di San Miniato, Ruggero Bellio, Luca Grassetti and Paolo Vidoni	1389
Bayesian structural learning for Latent Class Model with an application to Record Linkage  Davide Di Cecco	1395
Multilevel Latent Class modelling to advise students in self-learning platforms: an application in the context of learning Statistics  Roberto Fabbricatore, Zsuzsa Bakk, Roberto Di Mari, Mark de Rooij and Francesco Palumbo	1401
Latent Markov models with associated mixed responses  Alfonso Russo and Alessio Farcomeni	1407
Methods for health studies	1413
Beyond the fragility index Piero Quatto and Enrico Ripamonti	1414
Evaluation of the diagnostic-therapeutic paths for schizophrenic patients through state sequences analysis  Laura Savaré, Giovanni Corrao and Francesca leva	1419
Optimal timing of bone-marrow transplant in myelodysplastic syndromes through multi-state modeling and microsimulation Caterina Gregorio, Marta Spreafico and Francesca leva	1425
A fully Bayesian approach for sample size determination of Poisson clinical trials  Susanna Gentile and Valeria Sambucini	1431

Compartmental models in epidemiology: Application on Smoking Habits in Tuscany  Alessio Lachi, Cecilia Viscardi, Maria Chiara Malevolti, Giulia Carreras and Michela Baccini	1437
Covid-19 Assessment and Evaluation 2	1443
We are in the same storm but not in the same boat: Impact of COVID-19 on UK households  Demetrio Panarello and Giorgio Tassinari	1444
A network approach to investigate learning experiences and social support in higher education  Ilaria Primerano, Maria Carmela Catone, Giuseppe Giordano, Maria Prosperina Vitale	1450
Physical and cultural activity, internet use and anxiety of Italian university students during the pandemic  Giovanni Busetta, Maria Gabriella Campolo and Demetrio Panarello	1456
The digital divide in Italy before and during the pandemic phase	1462
Covid-19 and financial professional advice  Marianna Brunetti and Rocco Ciciretti	1468
Bayesian modelling and inference 4	1472
Bayesian functional mixed effects model for sports data  Patric Dolmeta, Raffaele Argiento and Silvia Montagna	1473
Bayesian Optimization with Machine Learning for Big Data Applications in the Cloud Bruno Guindani, Danilo Ardagna and Alessandra Guglielmi	1479
Confidence distributions and fusion inference for intractable likelihoods  Elena Bortolato and Laura Ventura	1485
Wasserstein distance and applications to Bayesian nonparametrics  Marta Catalano, Hugo Lavenant, Antonio Lijoi and Igor Prunster	1491
Network Analysis and community detection	1497
Community detection in networks: a heuristic version of Girvan Newman algorithm 	1498
Geographically weighted regression for spatial network data: an application to traffic volumes estimation  Andrea Gilardi, Riccardo Borgoni and Jorge Mateu	1504
Asymmetric Spectral Clustering: a comparison between symmetrizations  Cinzia Di Nuzzo and Donatella Vicari	1510
Community detection of seismic point processes  Valeria Policastro, Nicoletta D'Angelo and Giada Adelfio	1516

An Explorative analysis of Different Distance Metrics to Compare Unweighted Undirected Networks  Anna Simonetto, Matteo Ventura and Gianni Gilioli	1522
Gender, attitudes and family ties	1528
Parents of a disabled child in Italy: less healthy but more civically engaged  Nicoletta Balbo and Danilo Bolano	1529
Searching the nexus between women's empowerment and female genital cutting (FGC)  Patrizia Farina, Liva Ortensi, Thomas Pettinato and Enrico Ripamonti	1535
Social stratification, gender, and attitudes towards voluntary childlessness in Europe: A double machine learning approach	1539
Integrating structuralism and diffusionism to explain the new Italian emigration  Francesca Bitonti	1545
On the effects of rooted family ties in business networks: The South of Italy in the 19th century  Roberto Rondinelli, Giancarlo Ragozini and Maria Carmela Schisani	1551
Methods and Applications in Clustering	1557
A semi-supervised clustering method to extract information from the electronic Word Of Mouth  Giulia Contu, Luca Frigau, Maurizio Romano and Marco Ortu	1558
Spectral approach for clustering three-way data Cinzia Di Nuzzo and Salvatore Ingrassia	1564
Double clustering with a matrix-variate regression model: finding groups of athletes and disciplines in decathlon's data  Mattia Stival, Mauro Bernardi, Manuela Cattelan and Petros Dellaportas	1570
Classification of the population dynamics Federico Bacchi and Laura Neri	1576
Locating γ-Ray Sources on the Celestial Sphere via Modal Clustering Anna Montin, Alessandra R. Brazzale and Giovanna Menardi	1582
Sampling and Official Statistics	1588
Fisher's Noncentral Hypergeometric Distribution for Population Size Estimation  Veronica Ballerini and Brunero Liseo	1589
Small area models for skew and kurtotic distributions  Maria Rosaria Ferrante and Lorenzo Mori	1595

The use of remotely sensed data in sampling designs for forest monitoring  Chiara Bocci, Gherardo Chirici, Giovanni D'Amico, Saverio Francini and Emilia Rocco	1601
Analyzing different causes of one-inflation in capture recapture models for criminal populations  Davide Di Cecco, Andrea Tancredi and Tiziana Tuoto	1607
Administrative database and official statistics: an IT and statistical procedure  Caterina Marini and Vittorio Nicolardi	1613
Spatial modeling and Analyses	1619
Spatial statistics analysis using microdata: an application at agricultural sector  Daniela Fusco, Maria Antonietta Liguori, Valerio Moretti and Francesco Giovanni Truglia	1620
Bayesian spatial modeling of extreme precipitation  Federica Stolf	1627
A proposal to adjust local Moran's I for measuring residential segregation  Antonio De Falco and Antonio Irpino	1632
Accurate directional inference for gaussian graphical models  Claudia Di Caterina, Nancy Reid and Nicola Sartori	1637
Advances in Classification	1643
Measures of interrater agreement based on the standard deviation Giuseppe Bove	1644
A Comparison of accuracy measures for Classification tasks  Amalia Vanacore and Maria Sole Pellegrino	1650
Iterative Threshold-based Naive Bayes Classifier: an efficient Tb-NB improvement  Maurizio Romano, Gianpaolo Zammarchi and Giulia Contu	1656
Reprogramming FairGANs with Variational Auto-Encoders: A New Transfer Learning Model Beatrice Nobile, Gabriele Santin, Bruno Lepri and Pierpaolo Brutti	1662
Robust statistics	1669
Combinatorial Analysis of Factorial Designs with Ordered Factors Roberto Fontana and Fabio Rapallo	1670
Robustifying the Rasch model with the forward search  Anna Comotti and Francesca Greselin	1676
A novel estimation procedure for robust CP model fitting  Valentin Todorov, Violetta Simonacci, Michele Gallo and Nikolay Trendafilov	1682

A robust approach for functional ANOVA with application to additive manufacturing  Fabio Centofanti, Bianca Maria Colosimo, Marco Luigi Grasso, Alessandra Menafoglio, Biagio Palumbo and Simone Vantini	1688
Modeling unconditional M-quantiles in a regression framework  Luca Merlo, Lea Petrella and Nicola Salvati	1692
Model-based clustering	1696
Bayesian mixtures of semi-Markov models Rosario Barone and Andrea Tancredi	1697
Specification of informative priors for capture-recapture finite mixture models  Pierfrancesco Alaimo Di Loro, Gianmarco Caruso, Marco Mingione, Giovanna Jona Lasinio and Luca Tardella	1703
Clustering multivariate categorical data: a graphical model-based approach  Francesco Rettore, Michele Russo, Luca Zerman and Federico Castelletti	1709
The Gaussian mixture model-based clustering for the comparative	
analysis of the Healthcare Digitalization Index in the Italian local health authorities  Margaret Antonicelli, Michele Rubino and Filomena Maggino	1715
Student performance evaluation	1721
Rasch model versus Rasch Mixture model: strengthens and limits in identifying factors affecting students' performance in mathematics	s 1722
Does taking additional Maths classes improve university performance?  Martina Vittorietti, Andrea Priulla and Massimo Attanasio	1728
University dropout and churn in italy: an analysis over time Barbara Barbieri, Mariano Porcu, Luisa Salaris, Isabella Sulis, Nicola Tedesco and Cristian Usala	1734
The ANOGI for detecting the impact of education and employment on income inequality  Elena Fabrizi, Alessio Guandalini and Alessandra Spagnoli	1740
What causes juvenile crime? a case-control study  Elena Dalla Chiara and Federico Perali	1747
Methods and Applications in Survival analysis	1753
Recursive partitioning for survival data  Ambra Macis	1754
Detecting survival patterns in a digital learning platform  Marta Cannistrà, Mara Soncin and Federico Frattini	1760
An extension of proper Bayesian bootstrap ensemble tree models to survival analysis	1766

Modelling time to university dropout by means of time-dependent frailty COX PH models  Mirko Giovio, Paola Mussida and Chiara Masci	1771
Family history in survival and disease development  Maria Veronica Vinattieri and Marco Bonetti	1777
Text mining	1783
Topics & metaverse: an explorative analysis  Emma Zavarrone, Alessia Forciniti, Emanuele Parisi, Maria Gabriella Grassia	1784
Applying Topic Models to bibliographic search: some results in basketball domain  Manlio Migliorati and Eugenio Brentari	1791
Exploiting Text Mining and Network Analysis for future scenarios development: an application on remote working  Yuri Calleo, Simone Di Zio and Vanessa Russo	1797
Emotion recognition in Italian political language to predict positionings and crises government  Alessia Forciniti and Emma Zavarrone	1803
What does your self-description reveal about you?	1809
Variable selection and complete matrix approaches	1815
A Statistical Approach for the Completion of Input-Output Tables Rodolfo Metulini, Giorgio Gnecco, Francesco Biancalani and Massimo Riccaboni	1816
On multivariate records over sequences of random vectors with Marshall-Olkin dependence of components  A. Khorrami Chokami and Simone A. Padoan	1822
The joint censored gaussian graphical lasso model  Gianluca Sottile, Luigi Augugliaro and Veronica Vinciotti	1829
Variable selection with unbiased estimation: the cdf penalty  Daniele Cuntrera, Vito M.R. Muggeo and Luigi Augugliaro	1835
Automatic variable selection for MIDAS regressions: an application  Consuelo Rubina Nava, Luigi Riso and Maria Grazia Zoia	1841
Distribution Theory and Estimation	1847
A general framework for unit distributions Francesca Condino, Filippo Domma and Bozidar V. Popovic	1848
Prediction intervals based on multiplicative model combinations  Valentina Mameli and Paolo Vidoni	1854
Some advances on pairwise likelihood estimation in ordinal data latent variable models  Giuseppe Alfonzetti and Ruggero Bellio	1860

Functional Data Analysis	1866
A new functional clustering method: the Functional Clustering and Dimension Reduction model  Adelia Evangelista and Stefano Antonio Gattone	1867
Nonparametric functional prediction bands: theory with an application to bike sharing mobility demand in the city of Milan Jacopo Diquigiovanni, Matteo Fontana and Simone Vantini	1873
An R package for the statistical process monitoring of functional data  Christian Capezza, Fabio Centofanti, Antonio Lepore, Alessandra Menafoglio, Biagio Palumbo and Simone Vantini	1878
Trend filtering for functional regression  Federico Ferraccioli, Alessandro Casa and Marco Stefanucci	1884
Conformal prediction for spatio-functional regression models  Diana, Romano, Irpino	1890
Tourism and sport studies	1895
Assessing satisfaction of tourists visiting Italian museums: evidence from the eWOM  Daria Mendola and Valentina Oddo	1896
COVID-19 pandemic and tourism demand: a comparison between Spain and Italy  Caterina Sciortino, Ludovica Venturella and Stefano De Cantis	1902
A compositional analysis of tourism in Europe	1908
Improving administrative data quality on tourism using Big Data  Antonella Bianchino, Armando d'Aniello and Daniela Fusco	1914
Geographical variations of socio-demographic issues	1920
Elderly HCE and health care need: comparing spatially unexplained levels  Irene Torrini, Laura Rizzi and Luca Grassetti	1921
Measuring sustainable development at the regional level. The case of Italy  Marianna Bartiromo and Enrico Ivaldi	1927
Socio-economic deprivation and COVID-19 infection: a Bayesian spatial modelling approach  Antonino Abbruzzo, Andrea Mattaliano, Alessandro Arrigo, Salvatore Scondotto and Mauro Ferrante	1933
Applications in Economics	1939
The measurement of economic security through relative indicators	1940

A regional analysis of the efficiency by energy's producers in Italy  Gianna Greca, Giuseppe Cinquegrana and Giovanni Fosco	1946
On investigating social and financial aspects of Cardano Stefano Vacca, Marco Ortu, Gianpaolo Zammarchi and Giuseppe Destefanis	1953
Combined permutation test on the effect of age of micro enterprises on the propensity to Circular Economy  Stefano Bonnini and Michela Borghesi	1959
Comparison of Two Different Approaches to Measure Economic Access to Food and Insecurity: an Application to Mexican data Stefano Marchetti, Luca Secondi and Adrian Vargas-Lopez	1965
Image analysis and visual methods	1971
Bias correction of the maximum likelihood estimator for Emax model at the interim analysis Caterina May and Chiara Tommasi	1972
Visual and automated methods in digital microscopy to evaluate fungal colonisation on plant roots  Ivan Sciascia, Andrea Crosino and Andrea Genre	1977
From satellite images to road pavement type: an object-oriented classification approach  Arianna Burzacchi, Matteo Landrò and Simone Vantini	1983
Valid inference for group analysis of functionally aligned fMRI images  Angela Andreella, Riccardo De Santis and Livio Finos	1987
Topological persistence for astronomical image segmentation Riccardo Ceccaroni, Pierpaolo Brutti, Marco Castellano, Adriano Fontana and Emiliano Merlin	1993
Statistical assessment and empirical estimation	1999
Confidence regions for optimal sensitivity and specificity of a diagnostic test  Gianfranco Adimari, Duc-Khanh To and Monica Chiogna	2000
On the sensitiveness to the memory parameter in the network of tennis  Alberto Arcagni, Vincenzo Candila and Rosanna Grassi	2006
Two-part model with measurement error  Maria Felice Arezzo, Serena Arima, and Giuseppina Guagnano	2011
Statistical assessment of practical significance  Andrea Ongaro, Sonia Migliorati, and Enrico Ripamont	2017
Autoregressive and mixed effects models	2023
Asymptotic Properties of the Nonlinear Least Squares Estimator in HE-HAR Models  Emilija Dzuverovic and Edoardo Otranto	2024



A note on testing for threshold non-linearity in presence of heteroskedasticity in time series  Simone Giannerini and Greta Goracci	2030
The conditional autoregressive Whart-G model  Massimiliano Caporin and Marco Girardi	2036
Semi-parametric generalized linear mixed effects models for binary response for the analysis of heart failure hospitalizations  Alessandra Ragni, Chiara Masci, Francesca leva and Anna Maria Paganoni	2042
Issues in Data science	2048
etree: Classification and Regression With Structured and Mixed-Type Data in R Riccardo Giubilei, Tullia Padellini and Pierpaolo Brutti	2049
Deep Learning framework for ungrouping coarsely aggregated vital rates  Andrea Nigri	2055
Inside the metaverse: analysis of the state of the art and development of a new usage approach based on quality and ethics  Vito Santarcangelo, Emilio Massa, Saverio Gianluca Crisafulli, Antonio Ruoto, Angelo Lamacchia, Alessandro D'Alcantara, Alessandro Verderame and Massimiliano Giacalone	2061

# Preface

This book includes the contributions presented at the 51st Scientific Meeting of the Italian Statistical Society (SIS) held in Caserta at the Università della Campania "Luigi Vanvitelli", from the 22nd to 24th of June, 2022.

The conference has registered more than 300 presentations, including 4 keynotes in plenary invited sessions and 9 presentations in 3 guest sessions, 48 presentations collected in 16 specialized sessions and 68 presentations in 17 solicited sessions, all dealing with specific themes in methodological and/or applied statistics and demography. Furthermore, more than 200 contributions, with one or more authors, have been spontaneously submitted to the Program Committee and arranged in 43 contributed sessions.

The high number of contributions and the large participation at the conference show that researchers have met the challenge of pursuing working even in the face of the pandemic period from which we are only now emerging. The research activity in our field therefore has never stopped, and the desire to participate in scientific events, as a place for exchange and discussion on new developments in our field, remains a living characteristic of our scientific community.

With the publication of this book, we wish to offer to all members of the Italian Statistical Society, all international academics, researchers, Ph.D. students, and all interested practitioners, a good snapshot of the on-going research in the statistical and demographic fields. We deeply thank all contributors for having submitted their works to the conference and all the researchers for their remarkable job in acting as referees accurately and timely. We also would like to thank the International Biometric Society (IBS) – Italian region, the European Network for Business and Industrial Statistics (ENBIS) and the Italian Society of Statistical Physics (SIFS) we had the pleasure of hosting. A special thanks is addressed to the Scientific and Organizational Committees for their great efforts devoted to all the organizational aspects, to the Università della Campania "Luigi Vanvitelli" and to the Department of Mathematics and Physics who made this event possible, as well as to the Municipality of the Town of Caserta who has patronized the event and to all the funders for their supports.

Finally, we wish to express our gratitude to the publisher Pearson Italia for all the support received.

# Analyzing different causes of one-inflation in capture recapture models for criminal populations.

Modelli cattura-ricattura per la stima di popolazioni criminali: analisi delle diverse cause di one-inflation.

Davide Di Cecco, Andrea Tancredi and Tiziana Tuoto

Abstract Our goal is the estimation of the size of various criminal populations on the basis of administrative data on criminal proceedings by exploiting capture–recapture models for repeated count data. The data at our disposal exhibit an abundance of units that are captured exactly once, which suggests the necessity of explicitly modeling this deviation. We distinguish three possible causes for this phenomenon, namely, the erroneous inclusion of out–of–scope units, a particular behavioural effect preventing subsequent captures after the first one, and missed links in a Record Linkage step. We then propose three families of "one–inflated" models to estimate the number of uncaptured units which we compare on datasets of Italian criminal proceedings.

Abstract L'utilizzo di modelli cattura ricattura per stimare il numero di criminali non è nuovo in letteratura. In questo lavoro intendiamo stimare il numero di individui connessi a specifiche attività criminali in Italia sulla base dei dati sul numero di provvedimenti giudiziari individuali. I dati mostrano chiaramente la necessità di modellizzare l'eccesso di individui catturati solo una volta. Individuiamo 3 cause possibili per questo fenomeno noto come "one-inflation": la presenza di unità che andrebbero escluse dalla popolazione; un behavioural effect già noto nela stima delle popolazioni animali; e la presenza di mancati abbinamenti in una fase preliminare di Record Linkage. Proponiamo di conseguenza 3 strategie per le 3 possibili cause.

**Key words:** Criminal populations. Capture-recapture. Official statistics.

Davide Di Cecco

Università di Roma La Sapienza e-mail: davide.dicecco@uniroma1.it

Andrea Tancredi

Università di Roma La Sapienza e-mail: andrea.tancredi@uniroma1.it

Tiziana Tuoto

ISTAT, e-mail: tuoto@istat.it

### 1 Introduction

Estimating the number of people involved in certain illegal activities helps us in allocating the police forces to counter it, in evaluating the effectiveness of prevention and counteraction policies, and in evaluating the economic value associated to those activities. The European Parliament and Council identified the smuggling of goods, prostitution exploitation and drug trafficking as the main sources of illegal economic transactions to report in the national accounts aggregates. In this work we aim at estimating the number of people involved in these three illegal activities in Italy during 2014 by exploiting administrative data on criminal proceedings in a capture–recapture model.

Data from the Ministry of Justice report alleged crimes for which the judicial authority started a criminal proceeding. We count the number of times each individual appears in the Prosecutor's offices registers. Under a (reasonable) assumption of time–homogeneous capture probabilities, the data can then be summarized as counts of units captured j times,  $\{n_j\}_{j=1,2,...}$ .

Figure 1 depicts our data. We observed a total of 3349 smugglers (top figure), 2740 prostitution exploiters (mid), and 34964 drugs traffickers (bottom).

The common parametric approach to estimate the number  $n_0$  of individuals unreported to the justice system, is to define a counting distribution for the observed (truncated in zero) number of captures in the population. We considered various distributional alternatives: Poisson, Geometric, Negative Binomial, finite mixtures of Poisson and of Geometric. Even considering different parametric options, in all three observed distributions the number of units captured exactly once exceeds the expectation under the model hypothesis. This phenomenon is known in literature as "one–inflation" and is of particular importance, as it typically implies a substantial difference in the estimates of  $n_0$ .

#### 2 Causes of one-inflation

One-inflation might be generated by different factors, and we have identified the following three possible mechanisms:

- 1. a specific behaviour of the units, which learn how to avoid subsequent captures after the first one;
- 2. the presence of spurious units which do not belong to the reference population;
- 3. errors in re-identifying the units (linkage errors), due to the lack of unique identifiers and error-prone soft identifiers.

In our data we cannot exclude any of the previous factors having an impact on the observed excess of "ones".

The first mechanism generating one–inflation can be viewed as an extreme form of what in animal abundance analysis is called "trap shy" behaviour. In our case, we suppose that, after the first capture, a portion of persons involved in illegal activities

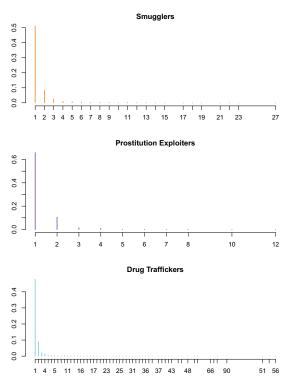


Fig. 1 Relative frequencies of observed number of captures for smugglers (top), prostitution exploiters (mid), and drug traffickers (bottom) in Italy in 2014

acquires the necessary knowledge/ability to avoid any subsequent capture. This can be formalized as a latent subpopulation presenting right—censored data, as we only know that their potential number of captures is larger than one. This hypothesis has been explored in depths in several recent papers (see, e.g., [6], [7], [8], [1]).

We cannot exclude the presence of spurious cases as source of one–inflation in our data. Indeed, we analyse records from the reported offences for which the judicial authority started a proceeding. However, we actually do not have information on whether the person reported was sentenced in court or acquitted. Then, a portion of the units captured once may be out–of–scope, and should be discarded from the analysis. The presence of out–of–scope or spurious captures has been considered, for example, in [2], [5]. Under this hypothesis, the observed value  $n_1$  represents an upper bound for the real number of criminals captured once.

Finally, due to privacy issue, our data are not provided with a unique identifier, hence, we cannot exclude the possibility of one—inflation deriving from linkage errors. In fact, when matching information does not suffice to recognise multiple captures of the same individual, the resulting missing links erroneously increase the number of singletons. The effect of linkage errors on population size estimates in the

multiple system estimation framework has been investigated both with a Bayesian perspective, see [9] and with a frequentist approach [3], and [4].

To the best of our knowledge, the explicit modeling of linkage errors in repeated count data for population size estimation is a topic not previously considered. In this contribution, we will show some possible linkage errors modeling in this setting, to derive population size estimates that will take into account the linkage uncertainty. In addition, we compare and discuss the estimates produced by the different sources of one–inflation.

## 3 Linkage errors in repeated count data

The lack of unique identifiers is a common situation both in social science and in natural science applications. Linkage procedures allow recognising the same unit even in the absence of a unique identifier, hence they are a prerequisite for population size estimates. Usually, the linkage is far from being a simple operation and it might introduce some errors, namely false and missed links. The linkage procedure finds a trade—off between the two kinds of linkage errors. In addition, the two errors have opposite effects on repeated count data, and consequently on population size estimates. The false links erroneously increase counts greater than one, since different units are erroneously recognised as the same one. On the other side, missed links, i.e. failure in recognising the same unit, increase the number of singletons.

Since the linkage procedure is actually a statistical activity, the one-inflation generated by linkage errors can be considered from both a primary and a secondary analysis perspective. In the former, the linkage and the population size estimate are viewed as components of a unique process and, via a hierarchical structure, as in [9] and [10], we are able to propagate the uncertainty between the parameter estimation step and the matching procedure. A clear advantage of this approach is that we are able to take into account at the same time both the two types of linkage errors.

Due to its relevance in real life application, we also consider the secondary analysis perspective, that is we assume that the linkage has been performed by someone else, and only quality indicators like linkage errors are available to be included in the subsequent analysis. In this perspective we explicitly model the one–inflation caused by missed links, since usually the linker tries to minimise the false matches, at the price of accepting some highest level of missed link errors. A specific characteristic of this model is the additional uncertainty affecting the total number of distinct units, as a consequence of the linkage error itself. Actually, assuming that our data is affected by missed links reduces the sample size in terms of distinct units and the observed one can be considered an upper–bound of the true one. On the contrary, when modeling the one–inflation due to the behavioural effect and spurious cases, we can consider as fixed the observed number of distinct units.

### 4 Results

For the sake of brevity, we only show in Table 4 some results on prostitution exploiters data, considering both non inflated and one-inflated models and other standard estimates for the proposed setting. For the one-inflation model generated by linkage errors we assume a secondary analysis framework. In particular we show the results obtained by taking a Poisson and a Geometric distribution for the individual captures y\* and assuming that the observed captures y are given by a Binomial variate with size  $y^* - 1$  and that  $y^* - y$  extra singletons are added to the data set. The idea underlying the model is that when the individual records subsequent to the first capture are compared with the initial record we may fail to link the records reducing the number of captures for that individual from  $y^*$  to  $y^* - m$  where m is the number of missing links. Moreover the missing links cannot be matched to any other records. In fact, we exclude both the possibility to have false matches and the chance to reconstruct, by the missing links, a sub-cluster of records referring to a given individual. This way the missing links may provide only single captures. Note also that while for the one-inflation caused by behavioural effects and spurious cases, Bayesian inference can be obtained via standard Markov Chain Monte Carlo simulation algorithms, for the one-inflation model caused by linkage error, due to the likelihood intractability, we opted for an approximate Bayesian computation (ABC) approach.

Estimator/Model	Ñ	95%CI. <i>Ñ</i>	
Ignoring one-inflation			
Poisson	7210	6780 - 7689	
Geometric	13332	12415 - 14394	
Chao	9851	8961 - 10868	
Zelterman	10030	9033 - 11027	
Poisson Mixture model	10073	9049 - 11110	
Modeling one-inflation		behavioural effect	ŵ
One-inflated Poisson	3895	3656 - 4156	0.645
One-inflated Geometric	8182	7406 - 9233	0.478
One-inflated Poisson mixture model	6613	5284 - 9870	0.261
Modeling one-inflation		spurious cases	ψ
One-inflated Poisson	3154	3035-3304	0.560
One-inflated Poisson mixture model	4711	3744 - 8799	0.163
Modeling one-inflation		linkage error	μ
One-inflated Poisson	2362	2090 - 2681	0.645
One-inflated Geometric	9384	7896 - 10720	0.323

**Table 1** Prostitution exploitation data: posterior mean and credible intervals for the population size N, posterior mean for the one-inflation parameters  $\omega, \psi$  and  $\mu$  accordingly to the source of one-inflation.

Specification on the different models and additional results will be presented during the conference and in an extended version of this contribution.

## References

- 1. Böhning, D., Friedl, H. (2021). Population size estimation based upon zero-truncated, one-inflated and sparse count data. Statistical Methods & Applications, 1–21.
- 2. Böhning, D., van der Heijden, P. G. (2019). The identity of the zero-truncated, one-inflated likelihood and the zero-one-truncated likelihood for general count densities with an application to drink-driving in Britain. The Annals of Applied Statistics, 13(2), 1198–1211.
- 3. Di Consiglio, L., Tuoto, T. (2018). Population size estimation and linkage errors: the multiple lists case. Journal of official statistics, 34(4), 889–908.
- Di Consiglio, L., Tuoto, T., Zhang, L.C. (2019). Capture-recapture methods in the presence of linkage errors. In Analysis of integrated data(pp. 39–71). Chapman and Hall/CRC
- 5. Fegatelli, D., Farcomeni, A., Tardella, L. (2017). Bayesian population size estimation with censored counts. In *Capture-recapture methods for the social and medical sciences* (pp. 371–385). Chapman and Hall/CRC.
- Godwin, R., Böhning, D. (2017). Estimation of the population size by using the one-inflated positive Poisson model. Journal of the Royal Statistical Society: Series C (Applied Statistics),66(2), 425–448.
- 7. Godwin, R. (2017). One-inflation and unobserved heterogeneity in population size estimation. Biometrical Journal, 59(1), 79–93.
- 8. Godwin, R. (2019). The one–inflated positive Poisson mixture model for use in population size estimation. Biometrical Journal, 61(6), 1541–1556.
- 9. Tancredi, A., Liseo, B. (2011). A hierarchical Bayesian approach to record linkage and population size problems. Annals of Applied Statistics,5(2B), 1553–1585
- 10. Tancredi, A., Steorts, R., Liseo, B. (2020). A unified framework for de-duplication and population size estimation (with discussion). Bayesian Analysis, 15(2), 633-682.