Instructors:	Dr Zbigniew Karpiński, Dr Marta	a Kołczyńska, Dr Małgorzata Mikucka
Course title:	Quantitative methods of dat	a analysis: statistical theory and good
	practices.	
	WINTER Semester	SPRING Semester
HOURS	45	30
FREQUENCY	3 x 45 minutes every week	3 intensive sessions in March, April, and
	Mondays, 10 AM – 12.15 PM	May (in each session 2 consecutive days of
	First class: October 15, 2018	$4 \times 45$ of instruction + $2 \times 45$ individual
		consultations)

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### THE COURSE CORRESPONDS TO TOPICS: Statistical analysis of data, regression analysis

### ASSESSMENT

- Course open to all students
- Form of the course: lecture + computer lab + individual consultations
- The course will be conducted in English
- Credit requirements: homeworks and group research project

### **COURSE AIMS AND CONTENT**

Data on individual opinions, attitudes, values, and behaviours, as well as quantitative "indices" describing countries and regions, and increasingly also automatically generated digital trace data, are now easily available to every interested user. Powerful computers allow researchers and analysts to process complex and large datasets, comprising hundreds of thousands of records, in a matter of seconds. Specialised statistical software, both proprietary and open-source, enables students and scholars to "mine", model and visualise the data in novel and innovative ways. While these processes seem to make it easier for individuals and organisations, including governments, to make more informed choices and shape "evidence-based policies", there is also a relatively large margin for misusing or abusing the data, which may result from a poor understanding of the underlying concepts and methods (e.g., using *p*-value as a rule for deciding

between valid and invalid findings) or ill-shaped incentive structures (e.g., publication bias, *p*-hacking).

The purpose of this course is to teach students about the foundations of statistical analysis in the social sciences, beginning with the very basic concepts of statistical description, such as distribution and measures of central tendency and dispersion. While these concepts are rarely the sole focus of analysis, they are necessary building blocks for understanding the more complex tools and approaches, including linear regression and its extensions. The course covers two main extensions of linear regression. The first is the multilevel modelling, which is currently the method of choice in cross-national analyses and allows estimating the "effects" of macro-level variables, e.g. unemployment rate, on individual-level outcomes. The second extension are regression models for panel data (fixed and random effects models) to analyse change over time. During the course, the focus is less on the theory behind the methods and more on their correct application and on the interpretation of their results.

Class time will combine (1) a lecture presenting elements of statistical theoretical underpinnings of the discussed methods, and (2) a computer lab which allows students to acquire practical experience with statistical analysis and modelling of the data.

# EDUCATIONAL OUTCOMES

## Knowledge:

- Knowledge of the basic notions used to describe data (e.g. variable and level of measurement, sample, population, distribution, mean, variance etc.);
- Familiarity with the concepts describing relationships among variables (e.g. statistical independence, correlation, covariance);
- Understanding of linear regression analysis, knowledge of its assumptions and applicability;
- Knowledge of selected extensions of linear regression (logistic regression, multilevel models, panel data analysis) and understanding when and why they should be used;
- Awareness of the importance of replicability in quantitative research;

# Skills:

- Preparing the survey data for analysis and understanding their limitations;
- Correctly applying a particular statistical model to the data using STATA statistical software;
- Correctly interpreting the results of such analysis;
- Justifying the choice of model in an analysis; discussing the limitations and advantages of alternative statistical tools;
- Basic understanding of data visualization;
- Ability to search for and find data for secondary analysis in data archives and repositories; ability to use data documentation;
- Orientation in the types of data offered by cross-national survey projects;
- Effective organization of work on the project to ensure replicability of results.

# Social Competence:

- Working in a team: organizing work, allocating tasks, achieving objectives using varied competences and skills of team members
- Providing feedback to other students on research projects
- Presentation skills: structuring a presentation, public speaking

### READINGS

#### **First semester**

A recommended reading for the topics listed above is the text *Statistical Methods for the Social Sciences* by Alan Agresti and Barbara Finley.

#### Second semester

Readings are provided in the spring semester schedule below.

### **COURSE REQUIREMENTS**

**Class participation.** This course has an intensive schedule and it is vital that students come to all classes prepared, having read the assigned readings and reviewed the material from previous sessions. Students should actively participate in all class activities.

This course will increase in difficulty as the semester goes on. Thus, it is important to develop good study habits early on. While some of the material at the beginning of the semester may seem remedial, this knowledge is the basis for much more difficult analysis later on.

**Homework assignments (60% of the final grade).** The homework assignments (4 in the first semester, 3 in the second semester) are designed to facilitate your understanding of the concepts and problems addressed during the class. Homework assignments must be turned in by the due date specified in the assignment instructions and announced in class. Late assignments will not be graded. While studying with another student is permitted, the homework write-up must be your independent work.

**Group project (40% of the final grade).** At the beginning of the course you will be divided into groups of 3-4 persons. Each group will consist of students of possibly similar research interests and possibly varied initial competence in statistical analysis. During the year, each group will work on a research question related to their research interests and will attempt to answer this question by analyzing survey data. We encourage consultations with the instructors during this work. At the end of the first semester you will be asked to present your project's outline, including the research question, data, and preliminary analyses using the methods covered so far. During the last session of the course you will present your group's project and discuss the projects of other groups.

# Schedule for the Winter Semester

Dates	1	2	3
Week 1: Oct 15 – 19	Organisation. Introductions.	Basic concepts: population and samp	le, variable and measurement, levels of
	Screening test.	measurement, description and inferen	nce, types of quantitative research
Week 2: Oct 22 – 26	Distributions and their visu	alisation: univariate distributions,	Theory – Methods – Data triad
	cumulative distributions, joint distributions, conditional distributions.		
	Discrete and continuous distributions.		
Week 3: Oct 29 – Nov 2	Measures of central tendency.	Sources of secondary data: data	
	other quantiles.		archives, repositories. Cross-national
			surveys
Week 4: Nov 5 – 9	Measures of dispersion. Variane	Mini presentations by teams: Research	
	of variation for non-metric varia	bles. Standardized scores (z-scores).	topic, question, ideas for datasets
Week 5: Nov 12 – 16	Probability distributions for	continuous and discrete random	Intro to Stata: do-files, log files, data
	variables. Normal distribution.	Properties of distributions: critical	formats, opening data
	values, degrees of freedom. Stati	istical tables.	
Week 6: Nov 19 – 23	Random sampling, sampling	from a distribution. Central Limit	Intro to Stata: generating variables,
	Theorem. Sampling distributions	5.	recodes, subset
Week 7: Nov 26 – 30	Statistical inference about a population parameter: estimators and Stata lab		Stata lab
	their properties, point estimates, confidence intervals.		
	Type I and Type II Error. Effect	sizes, power	
Week 8: Dec 3 – 7	Null hypothesis significance tes	sting: one-sample t-test. Comparison	Stata lab
	of two groups: independent and	dependent samples.	
Week 9: Dec 10 – 14	Variance decomposition. ANOVA. Analysing association between categorical variables: Contingency tables,		
	Chi-squared test of independence	е.	1
Week 10: Dec 17 – 21	Replicability and reproducibility	Preregistration, publication bias, p-	Stata lab
	hacking, multiple comparisons p	roblem (and corrections)	
Week 11: Jan 7 – 11	Correlation: Pearson's r, Spearman's $\rho$ : assumptions, interpretation, Stata lab		Stata lab
	visualization.		
Week 12: Jan 14 – 18	Linear regression: assumption	ns, interpretation, and diagnostic.	Stata lab
	Univariate and multivariate regression.		
Week 13: Jan 21 – 25	Logistic regression: assumptions, interpretation, and diagnostic.		Stata lab
Week 14: Jan 28 – Feb 1	Review Project presentation		

### Schedule for the Spring Semester

Homework assignment: Linear regression			
March session	Multi-level models. Why use multilevel models? Examples of		
	problems which require multilevel models. Assumption of		
	independence of observations. Hierarchical data and problems related		
	to higher-level sampling. Random intercept and random slopes.		
	Interpretation of coefficients. Cross-level interactions. How to present		
	the results of multi-level analysis in oral presentation and in an article?		
	Reading: Luke, D. A. (2004). <i>Multilevel modelling</i> (Vol. 143). A Sage		
	University Papers Series: Quantitative Applications in the Social		
	Sciences. Selected chapters.; Hox, J. (2010). Multilevel analysis:		
	<i>Techniques and applications</i> (edition 2). Routledge. Selected chapters.		
Homework assignment: Multilevel models			
April session	Models for panel data. Why use longitudinal data? Longitudinal vs.		
	cross-sectional data. Which problems require using longitudinal data?		
	Balanced and unbalanced panels; attrition and refreshment samples;		
	individuals and households. Modelling of within person changes (fixed		
	effects models, first difference models) vs. modelling between person		
	differences of the dependent variable (between effects). Random		
	effects models, their strengths and limitations. How to present the		
	results of panel data analysis in oral presentation and in an article?		
	<b>Reading:</b> Longhi, S. and Nandi, A. (2015). A Practical Guide to Using		
	Panel Data. Sage. Selected chapters.		
Homework assignment: Models for panel data			
May session	Working with quantitative projects. Advantages of using script files		
	(do files in Stata) for replicability of the results. Use of working folders		
	and paths. Automated export of results in the form of tables and		
	figures. Documenting your work: versions, folders and subfolders,		
	comments.		
	Good practice in regression analysis. Which variables to include as		
	controls and which to exclude from a model? Omitted variable bias.		
	How to understand and discuss the size of effects? When do we need		
	interaction terms? Various types of interaction terms and their		
	interpretation. Non-response in survey data and the use of weights.		
Presentation and discussion of research projects			

Note: The dates provided here are tentative and may change depending on how the class proceeds. Some topics may take a bit more time than we have allowed for, and others may take somewhat less time. Any changes in dates will be announced in class.