

## Structural Models and Policy Evaluation

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| Course title - Intitulé du cours               | Structural Models and Policy Evaluation |
| Level / Semester - Niveau /semestre            | M2 / S2                                 |
| School - Composante                            | Ecole d'Economie de Toulouse            |
| Teacher - Enseignant responsable               | Olivier DE GROOTE – Ana GAZMURI         |
| Lecture Hours - Volume Horaire CM              | 30                                      |
| TA Hours - Volume horaire TD                   |   |
| TP Hours - Volume horaire TP                   | 0                                       |
| Course Language - Langue du cours              | Anglais                                 |
| TA and/or TP Language - Langue des TD et/ou TP | Anglais                                 |

### **Teaching staff contacts - Coordonnées de l'équipe pédagogique :**

Students with questions about the course material are encouraged to ask them during or at the end of class before requesting a meeting with the lecturer.

Meetings should be requested by email:

- Olivier De Groote [olivier.de-groote@tse-fr.eu](mailto:olivier.de-groote@tse-fr.eu)
- Ana Gazmuri [ana.gazmuri@tse-fr.eu](mailto:ana.gazmuri@tse-fr.eu)

### **Course Objectives - Objectifs du cours :**

In this course we introduce the structural approach of econometrics, focusing on the intuition behind the use and estimation of structural models. We show how to estimate the parameters of core components of an economic model (utility, profits, ...) that rationalizes the data we observe. Under certain conditions, it can then be used to perform simulations of policies that have not yet taken place, to calculate the welfare effects of different policies, and/or understand the mechanisms that drive the effects of a policy change. Moreover, they can help to identify the full distribution of causal effects of agents' choices when treatment effects are heterogeneous.

The focus is on applying the methods and interpretation of the results. We show how they can be estimated in STATA and we illustrate their importance using applications on several important questions in labor economics, development economics and related fields.

### **Prerequisites - Pré requis:**

Students should be familiar with basic concepts in econometrics and program evaluation and the statistical software STATA. This includes OLS regression, instrumental variables, maximum likelihood, and average treatment effects. This is covered in M1 intermediate econometrics + M1 program evaluation/M1 applied econometrics.

### **Practical information about the sessions - Modalités pratiques de gestion du cours :**

Students are expected to read the assigned papers before the class and participate actively in class discussions.

### **Grading system - Modalités d'évaluation :**

Grades will be based on two problem sets, in-class presentations and a final exam. You have to choose one paper to present during a class from a provided list (10% of the grade). Problem sets and the final exam will each account for 30% of the grade.

### **Bibliography/references - Bibliographie/références :**

The slides with the explanation in class will be sufficient to understand the basics of each method. For further reading, we recommend the following references for applied econometricians:

Arcidiacono, P., Ellickson, P.B., 2011. Practical Methods for Estimation of Dynamic Discrete Choice Models. *Annual Review of Economics* 3, 363–394.

Berry, S.T., 1994, Estimating Discrete-Choice Models of Product Differentiation, *RAND Journal of Economics*.

Berry, S.T., J. Levinsohn, and A. Pakes, 1995, Automobile Prices in Market Equilibrium, *Econometrica*.

Blundell, R., Costa Dias, M., 2009. Alternative Approaches to Evaluation in Empirical Microeconomics. *The Journal of Human Resources* 44, 565–640.

Cornelissen, T., Dustmann, C., Raute, A., Schönberg, U., 2016. From LATE to MTE: Alternative methods for the evaluation of policy interventions. *Labour Economics* 41, 47–60.

Train, K., 2009. Discrete choice methods with simulation. Cambridge University Press, Cambridge; New York.

Wooldridge (2002), *Econometric Analysis of Cross Section and Panel Data*, Chapter 15.

This and other sources from the econometrics literature are used to explain the methods in the context of several applications and policy questions to address. Other sources include:

Abdulkadiroglu, A., Pathak, P.A., Schellenberg, J, and Walters, C.R., 2017. Do parents value school effectiveness? NBER Working Paper 23912.

Angrist, J.D., and Pischke J.S., 2010, The Credibility Revolution in Empirical Economics: How Better Research Design is Taking the Con Out of Econometrics, *Journal of Economic Perspectives*. *Journal of Economic Perspectives*.

Aakvik, A., Heckman, J. J. & Vytlacil, E. J., 2005. Estimating treatment effects for discrete outcomes when responses to treatment vary: an application to Norwegian vocational rehabilitation programs. *Journal of Econometrics* 125, 15–51.

Arcidiacono, P. & Jones, J. B., 2003. Finite mixture distributions, sequential likelihood and the EM algorithm. *Econometrica* 71, 933–946.

Dupas, P. 2014. Short-Run Subsidies and Long-Run Adoption of New Health Products: Evidence from a Field Experiment. *Econometrica*.

Heckman, J. J. & Vytlacil, 2005. E. Structural equations, treatment effects, and econometric policy evaluation. *Econometrica* 73, 669–738.

Heckman, J. J., Humphries, J. E. & Veramendi, G., 2016. Dynamic treatment effects. *Journal of Econometrics* 191, 276–292.

Imbens, G. W. & Angrist, J. D., 1994. Identification and Estimation of Local Average Treatment Effects. *Econometrica* 62, 467.

Nevo, A., 2001, Measuring Market Power in the Ready-to-Eat Cereal Industry, *Econometrica*.

Nevo, A. and M.D. Whinston, 2010, Taking the Dogma Out of Econometrics: Structural Modeling and Credible Inference, *Journal of Economic Perspectives*.

Rust, J., 1987. Optimal Replacement of GMC Bus Engines: An Empirical Model of Harold Zurcher. *Econometrica* 55, 999–1033.

### **Session planning - Planification des séances :**

*Part 1 (Ana Gazmuri): introduction to structural models and static discrete choice (15h)*

- Applications in public policy:
  - o Antitrust policies<sup>1</sup>
  - o School choice policies<sup>2</sup>
  - o Evaluation of subsidies for technology adoption<sup>3</sup>
  - o Evaluation of a new public transportation systems
  
- Structure of the classes
  - o Introduction to structural models (1.5 h)
  - o Logistic regression as a random utility model (3h)
  - o Discrete choice models and alternative distributional assumptions (probit, logit, nested logit, ordered response models) (3h)

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<sup>1</sup> Nevo, A., 2000. Mergers with differentiated products: The case of the ready-to-eat cereal industry. *The RAND Journal of Economics*.

<sup>2</sup> Abdulkadiroglu, A., Pathak, P.A., Schellenberg, J, and Walters, C.R., 2017. Do parents value school effectiveness? NBER Working Paper 23912

<sup>3</sup> Dupas, P. 2014. Short-Run Subsidies and Long-Run Adoption of New Health Products: Evidence from a Field Experiment. *Econometrica*

- Estimation of discrete choice models with individual level data and aggregate data (4h)
- Endogeneity in non-linear models (1h)
- Counterfactual simulations (1.5h)
- Incidental parameters problem with binary response data (1h)

*Part 2 (Olivier De Groot): treatment effect heterogeneity and dynamic discrete choice models (15h)*

- Applications in public policy
  - Educational policies
    - Number of spots in college majors<sup>4</sup>
    - Subsidies and tuition<sup>5</sup>
    - Affirmative action<sup>6</sup>
  - Childcare expansion<sup>7</sup>
  - Vocational rehabilitation programs<sup>8</sup>
  
- Structure of the classes
  - Overview of second part of the course with returns to schooling as an example (1h)
  - Treatment effect heterogeneity in practice: estimating local, marginal and average treatment effects, and the impact of adding structure (5h)
  - Factor models and distributional treatments effects (1.5h)
  - Practical tools to interpret results of non-linear models (1.5h)
  - Forward looking behavior and the impact on counterfactual simulations (5h)
  - Dynamic treatment effects (1h)

### **Distance learning – Enseignement à distance :**

We will prioritize face-to-face classes if rules allow and if all students are able to be present. Otherwise we will use Zoom for online classes. Students will be required to have their cameras on and questions during the class will be encouraged. For this reason, we require all students to have webcams.

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<sup>4</sup> Kirkeboen, L. J., Leuven, E. & Mogstad, M. Field of Study, Earnings, and Self-Selection. *The Quarterly Journal of Economics* 131, 1057–1111 (2016).

<sup>5</sup> Keane, M. P. & Wolpin, K. I. The Career Decisions of Young Men. *Journal of Political Economy* 105, 473–522 (1997). ; Todd, P. E. & Wolpin, K. I. Assessing the impact of a school subsidy program in Mexico: Using a social experiment to validate a dynamic behavioral model of child schooling and fertility. *The American economic review* 1384–1417 (2006). ; Heckman, J. J., Humphries, J. E. & Veramendi, G. Returns to Education: The Causal Effects of Education on Earnings, Health, and Smoking. *Journal of Political Economy* 126, 51 (2018).

<sup>6</sup> Arcidiacono, P. Affirmative action in higher education: How do admission and financial aid rules affect future earnings? *Econometrica* 73, 1477–1524 (2005).

<sup>7</sup> Cornelissen, T., Dustmann, C., Raute, A. & Schönberg, U. Who Benefits from Universal Child Care? Estimating Marginal Returns to Early Child Care Attendance. *Journal of Political Economy* 126, 2356–2409 (2018).

<sup>8</sup> Aakvik, A., Heckman, J. J. & Vytlacil, E. J. Estimating treatment effects for discrete outcomes when responses to treatment vary: an application to Norwegian vocational rehabilitation programs. *Journal of Econometrics* 125, 15–51 (2005). ; Dean, D., Pepper, J. V., Schmidt, R. & Stern, S. The Effects of Vocational Rehabilitation Services for People with Mental Illness. *Journal of Human Resources* 52, 826–858 (2017).