

# Bocconi

## COMPARATIVE CASE STUDIES AND THE TRANSPORTABILITY OF POLICY OUTCOMES ACROSS THE SPACE



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**Marco Percoco**  
Department of Social and Political Sciences and  
GREEN

# (Policy) Background

- Cohesion policy is the largest development program in the world. One third of the EU budget allocated to urban and regional development and to promote socio-economic convergence
- Evaluation and monitoring activities have been important since the early stages of «structural funds»
- Recent (2012) call for **Counterfactual Impact Evaluation**
- Substantial body of literature on ex post counterfactual evaluation
- **The aim**: the fundamental issue of **Prospective Evaluation** is discussed.



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# OUTLINE

- 1. The role of evaluation**
- 2. Ex post counterfactual evaluation**
- 3. Prospective evaluation and transportability of policy outcomes**
- 4. (Some) Conclusions**



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# Evaluation in EU policy

- From «descriptive evaluation» to «counterfactual evaluation»
- An evaluation comparing (potential) Outcome B and (observed) Outcome A is a *counterfactual evaluation*;
- The evaluation process should evaluate the “success” of a given policy (in a certain sense it is the performance measurement of public policies)
- In causal inference, researcher wants to know whether one factor or a set of factors leads to (or causes) some outcome.
- In general, causal inference is the difference between two descriptive inferences. «Progress, don't regress»



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# Literature (Counterfactual)

- Hagen and Mohl (2008): SF payments with a generalized propensity score and estimating a dose response function. Positive, but not statistically significant impact on regional growth.
- Becker *et al.* (2010) adopt a regression discontinuity design (RDD) around the threshold of 75% of the EU per capita GDP. Positive and statistically significant effect of Objective 1 transfers
- Heterogeneity in terms of absorptive capacity (Becker *et al.*, 2011)



# Literature (heterogeneity)

- Becker et al. (2012) and Percoco (2017) hypothesize that the impact of cohesion policy depends on some characteristics (institutions, education, economic structure)
- They make use of the fuzzy Heterogeneous Regression Discontinuity Design (HRDD) approach
- Evidence of absorptive capacity as the impact of the quality of institutions and of education are positive and significant; no clear role of economic structure. Possible decreasing returns in the service sector.



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# Prospective evaluation

- The «Barca report» pointed, among other things, two needs for regional policy making:
  - The need of an extensive use of data to distinguish the effect of the policy from those of the environment (close to counterfactual evaluation)
  - The need to predict the effect of policy across the space (e.g. «what will happen in Andalusia had been implemented the same policy as in Campania?»)
- The political and policy rationale of ex post counterfactual evaluation is «from there to here», that is spatial extrapolation (prediction)
- Issue of knowledge:
  - Assumption of ignorability of place-specific covariates (this contradicts place-based policies)



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# A sympathetic critique of Counterfactual Evaluation

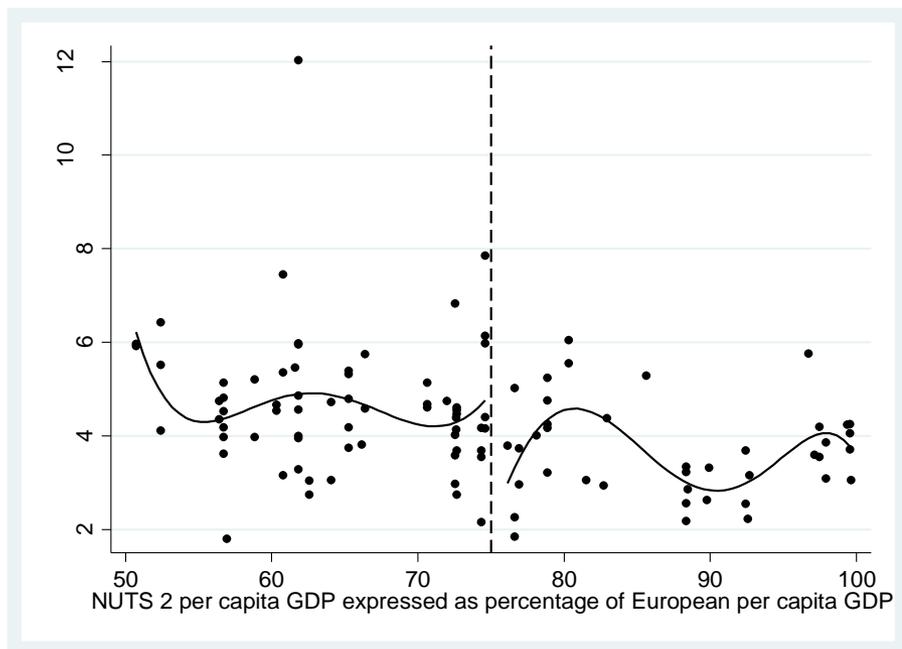
- Often, a **Local Average Treatment Effect (LATE)** is estimated and used
- **Local**: local explanatory power of policy effect estimators
- **Average**: ignoring the full distribution implies ignoring heterogeneity



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# Case 1: Regression Discontinuity



- Reliability only in a narrow interval around the threshold
- The spatial version of RDD poses more serious issues in terms of:
  - Spatial spillovers related to sorting
  - Sorting of firms and households
  - MAUP
- Is the LATE relevant for ALL regions (hence for policy makers of all regions)?



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# Prospective evaluation and counterfactual evaluation

— Prospect as prediction: predicting the effect on Andalusia of the policy implemented in Campania

— Two types of **predictions**:

**a) On the support**: use of the same information set

**b) Out of the support (extrapolation)**: use of information not used in the counterfactual evaluation



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# Prediction on the support – Case 2

- Problem of non-overlapping between treated and control regions → Application of the Angrist and Raikkonen (2013).

$$y = \alpha + \beta x + \gamma T + \delta z + \varepsilon$$

- Covariates  $z$   $t$  mimic (or are correlated with) the forcing variable (trend).
- The condition  $\beta = 0$  can be tested on given intervals.

## The Procedure

- **Step 1:** Identify a window in which the forcing variable is correlated with the set of covariates.
- **Step 2:** Covariates are used to predict the treatment status far from the threshold and hence to match units on the basis of similar covariates (

Application in Crescenzi et al. (2018) and Percoco (2016; 2018)



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# Prediction out of the support (Pearl, 2011)

**Transportability** : Given two populations denoted  $\pi$  and  $\pi^*$ , characterized by probability distributions  $P$  and  $P^*$ , and causal diagrams  $G$  and  $G^*$ , respectively, a causal relation  $R$  is said to be transportable from  $\pi$  to  $\pi^*$  if  $R(\pi)$  is estimable from the set  $I$  of interventional studies on  $\pi$ , and  $R(\pi^*)$  is identified from  $I$ ,  $P$ ,  $P^*$ ,  $G$ , and  $G^*$ .

**Direct transportability**: A causal relation  $R$  is said to be direct transportable from  $\pi$  to  $\pi^*$  if  $R(\pi)=R(\pi^*)$

**Conditional transportability**: A causal relation  $R$  is said to be trivially transportable from  $\pi$  to  $\pi^*$ , if  $R(\pi^*)$  is identifiable from  $(G^*, P^*)$ .



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# Case 3: Meta-analysis

—Meta-analysis is the statistical analysis of literature or of case studies

$$ES_i = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \dots + e_i$$

—The (spatial) prediction of ES, conditional on local characteristics in X gives a conditional transportability of the pollicy

—More reliable than direct transportability

—Holtz et al. (2005) as an alternative by using micro data



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# Conclusions

- Better LATE than nothing, but dangerous from a policy making perspective
- Ex post counterfactual evaluation may be trivial prospective evaluation
- Non-trivial (i.e. Adjusting for local characteristics) prospective evaluation can account also for spatial heterogeneity



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**THANK YOU FOR YOUR ATTENTION**

[MARCO.PERCOCO@UNIBOCCONI.IT](mailto:MARCO.PERCOCO@UNIBOCCONI.IT)



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