How much should we trust differences-in-differences estimates?

Carlos Lezama Advanced Microeconometrics ITAM

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Differences-in-Differences (DD) estimation consists of identifying a specific intervention or treatment. One then compares the difference in outcomes after and before the intervention for groups affected by the intervention to the same difference for unaffected groups.

The great appeal of DD estimation comes from its simplicity as well as its potential to circumvent many of the endogeneity problems that typically arise when making comparisons between heterogeneous individuals.

Obviously, DD estimation also has its limitations. It is appropriate when the interventions are as good as random, conditional on time and group fixed effects. Therefore, much of the debate around the validity of a DD estimate typically revolves around the possible endogeneity of the interventions themselves.

Focus on issues relating to the *standard error* of the estimate.

DD estimates and their standard errors most often derive from using Ordinary Least Squares (OLS) in repeated cross sections (or a panel) of data on individuals in treatment and control groups for several years before and after a specific intervention.

One then typically estimates the following regression using OLS:

$$Y_{ist} = A_s + B_t + cX_{ist} + \beta I_{st} + \varepsilon_{ist},$$

where the subscripts i, s, and t stand for the individual, group (such as a state), and time (such as a year), respectively. Furthermore, let Y be our outcome of interest, I be a dummy, A and B be fixed effects, X be relevant individual controls, and ε be an error term.

The estimated impact of the intervention is then the OLS estimate $\hat{\beta}$. Standard errors used to form confidence interval for $\hat{\beta}$ are usually OLS standard errors.

Remark

Note that this is valid only under the very restrictive assumption that changes in the outcome variable over time would have been exactly the same in both treatment and control groups in the absence of the intervention.

Three factors make serial correlation an especially important issue in the DD context:

- 1 DD estimation usually relies on fairly long time series.
- 2 The most commonly used dependent variables in DD estimation are typically highly positively serially correlated.
- 3 The treatment variable I_{st} changes itself very little within a state over time.

These three factors reinforce each other so that the standard error for $\hat{\beta}$ could severely understate the standard deviation of $\hat{\beta}$.

A Survey of DD Papers

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Overrejection in DD Estimation

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Parametric Methods

Block Bootstrap

Ignoring Time Series Information

Empirical Variance-Covariance Matrix

Arbitrary Variance-Covariance Matrix

Summary



Conclusion