



Impact Evaluation and Evaluation of Financial Programs

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What is the Decision?



- In thinking about performance measurement and (impact) evaluation, it's useful to ask

What is the Decision?

1. How can we manage the program better (holding the program model fixed)?
 - Personnel actions (remediation, firing, promotion bonuses)
 - Contractor management (firing, rehiring, incentive payments)
2. Should we change the program model?
 - Continue vs. close the program
 - Modify the program

These are different decisions

An American Perspective



- If you're going to ask “impact questions”—e.g., Does this program work at all? Would some change make it work better?—use impact analytic methods
- The United States has a strong and growing tradition of random assignment evaluations
 - But, I'm a biased observer: I am part of that tradition, and one of my major funders is in the room!
- The United States also has a strong tradition in rigorous non-experimental impact evaluation methods
 - PSM/Propensity Score Matching (Heinrich)
 - RD/Regression discontinuity
 - DiD/Difference in differences

A/B Testing



- If the decision concerns program improvement, consider A/B Testing (sometimes called “Planned Variation” or “Rapid Cycle Evaluation”); i.e.,
 - Randomly assign clients (or sites) to different program models
 - Compare outcomes
- As long as you are willing to focus on proximate outcomes, A/B Testing can be
 - (relatively) Fast,
 - (relatively) Cheap,
 - Raises few ethical issues

Continuous Evaluation



- For mandatory programs, another option is “continuous evaluation”; i.e.,
 - Exempt a randomly selected subsample from the program
 - Compare outcomes
- This is the approach in the American REA/Reemployment and Eligibility Assessment Program
- Implementation needs to be done with care
 - Need a truly random sample
 - With constant control fractions
 - <or more subtle analytic strategies>

On Benchlearning I



- Benchlearning asks impact evaluation questions; i.e., (how) Should we change the program model?
- But, the American literature suggests that such cross-national comparisons are unlikely to identify best practices
 - Differences in measurement (Heckman, Ichimura, and Todd, 1997)
 - Differences in local labor market conditions (Heckman, Ichimura, and Todd, 1997)
 - Other (unmeasured, not accounted for) policy variation (standard critique of observational studies)
 - Too many possible explanations (Greenberg, Meyer, Michalopoulos, and Wiseman, 2003)

On Benchlearning II



- Some versions seem more promising
- With longer time-series and changes in policy within countries, use difference-in-differences
 - See Klerman and Danielson (2009), Heinrich and Fournier (2004) for examples
- With proper within country impact estimates (e.g., random assignment, PSM) this is a meta-analysis problem
 - See Bloom, Hill, Riccio (2003) for a widely cited example
- It is often striking how little things matter
 - Both narrow policy choices and programs overall

Apply Evaluation Ideas to Performance Measurement/Management



- Consider using evaluation ideas to identify good performers (employees or contractors); i.e.,
 - Randomly assign cases to employees/contractors
 - Then differences in outcomes are either due to true differences in performance or chance (and statistics allows us to bound the impact of chance)
 - See Klerman (2005); Baehler and Klerman (2015)
- New York City does this for their welfare programs (Feldman 2011)
- Idea has been used in lots of research papers
 - Disability Policy: Dahl, Kostøl, and Mogstad (2014);
 - Recidivism: Di Tella and Schargrodsy (2014);
 - Child Protection: Doyle (2008);
 - Incarceration: Kling (2006)



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