



# A methodological approach for measuring net-impacts of Basic- and Complementary Redistributive- Income Support for Sustainability (BISS-CRISS) interventions (CAP 2023-2027) using FADN data

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# Outline

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- Methodological requirements for impact evaluation
- Evaluation experience
- Why is it difficult to evaluate BISS-CRISS?
- Consequences for evaluation
- Proposed methodology (DRF/GPSM)
- Strengths and weaknesses of the approach
- Lessons learnt and applicability

# Methodological requirements for impact evaluation

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1. Reliance on causal analysis! (rigorousness & credibility)
  - Ensuring that a causal model is explicitly incorporated
  - Causality vs. correlation! (high correlation does NOT imply causality => naïve approaches?)
2. High stability of obtained results (Reliability & Robustness)
  - Ideally: sensitivity is low and reduced to random factors
  - But, robustness depends on the specific limitations of the applied method!
3. Applied methodology => should allow to isolate effects of a specific intervention from other (e.g. exogenously determined) factors

Example of rigorous evaluation techniques => e.g. quasi-experimental approaches

# Evaluation practice

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- Recently, impact evaluations of CAP interventions have strengthened considerably (methodology applied)
- Yet, despite availability of advanced quasi-experimental methods only a few evaluation studies investigated effects of Basic Income Support (or Pillar 1 interventions) through rigorous impact evaluations methods. Why?

# Why is it difficult to evaluate BISS-CRISS?

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- In contrast to other CAP interventions (e.g. Pillar 2) BISS-CRISS support is provided to almost all farms (eligibility criteria > 1 ha) with a different intensity per farm
- Almost no existence of BISS-CRISS **not**-supported farms
- Problems with finding a suitable counterfactual, i.e. farm which did **not** receive BISS-CRISS support
- Additionally to BISS-CRISS => other 1st Pillar interventions (e.g. young farmers, sectoral, etc.) => separation of policy effects is necessary!
- Additionally to CAP 1st Pillar measures => 2nd Pillar measures and national measures => separation of policy effects is necessary!

# Why is it difficult to evaluate BISS-CRISS?

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## Consequences:

- Binary quasi-experimental methods relying on “BISS-CRISS supported” vs. “BISS-CRISS non-supported” (e.g. binary PSM-DID, exact matching, etc.) are not applicable
- Evaluation of 1st Pillar is more difficult than evaluation of 2nd Pillar (for latter a binary PSM-DID can be applied)
- Most evaluators of Pillar 1 prefer to utilize sectoral- or CGE models (policy scenarios: “base-run scenario” vs. “policy-scenario”, e.g. CAPRI, CGE modelling, etc. or spatial econometric analysis. However, these approaches are good for ex-ante evaluations but problematic for ex-post

# Possible evaluation question

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**Evaluation Question:** To what extent has BISS-CRISS support affected income and competitiveness of supported agricultural farms?

Possible outcome variables/Impact Indicators:

- Gross Farm Income (SE410) (output – interm. Consump + balance subs/taxes)
- Farm Net Value Added
- Farm economic size
- Farm employment
- Farm investments, etc.

=> application of naïve methods would be problematic!

# Proposed methodology => DRF/GPSM

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## **Dose Response Function (DRF) based on the Generalized Propensity Score Matching (GPSM)**

(see: Hirano, K. and G. W. Imbens. 2004; Imai, K. and Van Dyk, D. A., 2004)

- Several examples of recent applications of the DRF/GPSM method to evaluations of EU programmes/policies



# What is DRF/GPSM?

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- A quasi-experimental method enabling estimation of policy/subsidization effects conditional on observable determinants of subsidization intensity (i.e. received BISS-CRISS payments per farm)
- Here 3 different estimation approaches are possible:
  - Parametric (e.g. Hirano and Imbens, 2004)
  - Non-parametric, e.g. splin estimators, inverse weighting kernel estimator, etc. (Bia, et al., 2012)
  - Semi-parametric (e.g. Cattaneo, 2010; Flores, et al., 2012)

# Advantages of the DRF/GPSM methodology

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- GPS (as a balancing score) is **similar to Propensity Score (PS)** in a binary PSM (i.e. farms within the same strata of the GPS should look identical in terms of their observable characteristics X, independent of their level of BISS-CRISS subsidies)
- GPS is extension of PS for multiple/continuous treatments
- **Causality** model is explicitly incorporated
- Non-subsidized units/farms are **NOT** needed (however, they may be included if such data exists)
- **GPSM is built on counterfactuals.** Comparable **control groups** are constructed on the base of pre-subsidisation variables (covariates X) and the estimated GPS

# Advantages of the DRF/GPSM methodology (2)

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- GPSM belongs to a quasi-experimental setting => **enables to compare farms** with sufficiently similar characteristics (X) but different subsidization intensity (BISS-CRISS)
- GPSM **reduces/eliminates the selection bias** and addresses endogeneity
- GPSM is a base for derivation of **entire “dose-response” function (DRF)**, i.e. effects for each level of subsidization intensity

# Advantages of the DRF/GPSM methodology (3)

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- DRF/GPSM is a base for estimation of both **Average Treatment Effects (ATE)** as well as allows to assess the **marginal effects** (i.e. effects of increase by 1 unit, e.g. 100 EUR), in dependence on the support intensity level obtained
- DRF/GPSM can be applied to **answer many Evaluation Questions** regarding 1st Pillar (e.g. regarding effectiveness, efficiency, etc.)
- The analysis of multiple continuous treatments is actually at the **forefront of the current evaluation econometrics literature** (Imbens and Wooldridge, 2009)

# Application of DRF/GPSM method

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## Data:

- Y outcomes, e.g. farm income, farms value added, etc.
- Choice of confounding factors, e.g. variables/covariates X (e.g. farm size, employment, fixed assets, etc.) which determine **both the economic** effects of BISS-CRISS and a **participation/intensity** of the subsidization scheme
- Inclusion of **other** subsidies in the list of covariates (e.g. Pillar 2 and/or national) => Blocking!
- Amount of T (BISS-CRISS subsidies received by a farm in a given period)
- A period should include both pre- and post-subsidisation observations (years)
- The sample should be a balanced panel (optimal: the same farms before 2023 and after, e.g. 2028)

# Application of DRF/GPSM method

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Data sources (farm data):

- FADN (or farm bookkeeping database)
- Paying Agency data on obtained subsidies (also from other pillars!) for each farm
- Data links done anonymously in PA or national FADN Liaison Agencies

# Analytical four steps:

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1. **Estimation of the generalized propensity score (GPS)** as a conditional density of the treatment assignment (T), e.g. BISS-CRISS per farm, given the covariates (X)
2. Diagnostics: Validate GPS by **checking for covariate balance (!)**
3. **Response model:** Finding the appropriate functional relationship between the impact indicator (e.g. farm income), the intensity of the BISS-CRISS support, T, and the estimated values of GPS for each farm i.
4. Causal quantities of interest: **Estimation** of the average outcome for each potential level of support T and **the entire dose-response function**

# Empirical implementation:

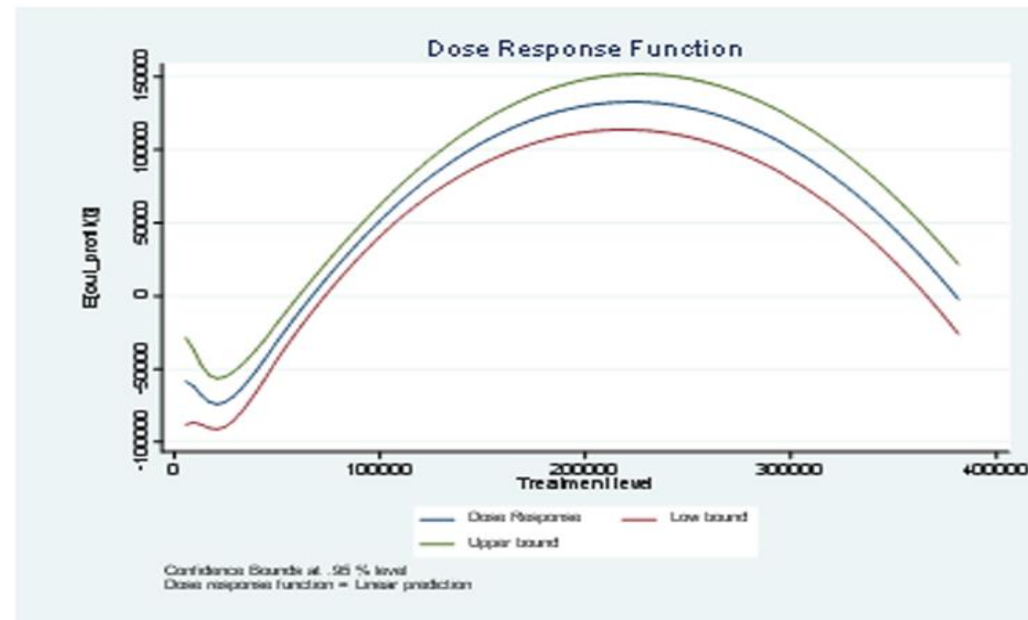
Implementation in STATA (different options, e.g. parametric, semi-parametric, etc.)

Possible Expectations

Gross Farm Income

BISS-CRISS intensity per farm

and Outcomes:



Graph 1. Estimated dose response function of AE intensity on farm profits.  
Source: own estimation.



# Caveats and conclusions

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## Caveats:

- Evaluation of 1<sup>st</sup> Pillar is more difficult than evaluation of 2<sup>nd</sup> Pillar (for latter a binary PSM-DID can be applied)
- Multivalued treatments (DRF/GPSM) increase the number of parameters that must be estimated in comparison to binary PSM-DID
- Abundant data is required
- Econometrics skills

# Caveats and conclusions

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## **Conclusion:**

- Regarding quantitative evaluation of 1<sup>st</sup> Pillar BISS-CRISS interventions at farm level => There are NOT too many serious alternatives to DRF/GPSM approach (!)

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# Thank you

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# Naïve approaches

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Practical implementation using a “naïve” approach (NOT based on counterfactuals):

$$Y_i = \beta'X_i + \alpha T_i + \varepsilon_i,$$

Y = outcome, e.g. farm income

X = structural covariates, e.g. size, employment, etc.

T = obtained subsidization from BISS-CRISS

Problems:

- T is endogeneous (depends on X, e.g. farm size) and correlated with error term
- Relationship between Y and T is unknown (can be linear, non-linear, and vary across supported farms, etc.)
- While above specification is misleading, a strong estimation bias would occur

Solution => a **rigorous quasi-experimental** approach using farm-data (i.e. micro-data, e.g. FADN + Paying Agency data)

# Recent applications of the DRF/GPSM method to evaluations of EU programmes/policies

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- EU Regional- and structural programmes:
  - **Regional data**, e.g. Becker S.O., et al. (2012); J Kluve, et al. (2012)
  - **Individual firm data**, e.g. Bia M., et al. (2011); Bia, M., and Mattei, A., (2012)
- CAP 1<sup>st</sup> Pillar => Single Payment Scheme (**farm-level data**), e.g. Michalek, J., et al. (2014); Esposti, R., (2014 a,b)
- CAP 2<sup>nd</sup> Pillar => Agri-environmental measures (**farm-data + GIS data**), e.g. Michalek, J. et al. (2022)
- CAP 2<sup>nd</sup> Pillar => Food processing sector (**regional data**), e.g. Michalek, J. et al. (2020)
- CAP 2<sup>nd</sup> Pillar => General development (**regional data**), e.g. Bakucs, et al., (2019), Michalek, J. (2012)
- Trade policies (**macro-economic data**), e.g. Magrini, et al., 2017

Publications in highly ranked journals: *European Economic Review* , *Journal of the Royal Statistical Society*, *Land Economics*, *Agricultural Economics*, *Land Use Policy*, *Regional Studies*, etc.