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Testing for Complementarity: Glyphosate Tolerant Soybeans and Conservation Tillage

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# Testing for Complementarity: Glyphosate Tolerant Soybeans and Conservation Tillage

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## Background

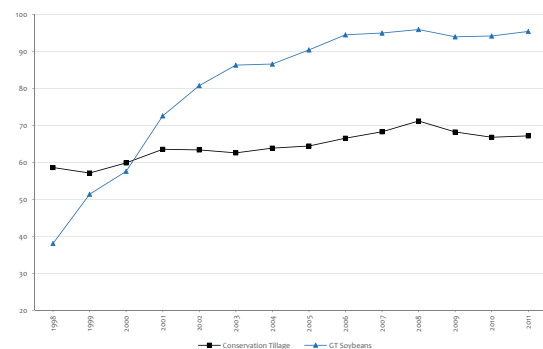
- Positive environmental impacts associated with the widespread adoption of glyphosate tolerant (GT) crops is a hotly debated hypothesis.
- Anecdotal and correlational evidence suggest that GT crops and conservation tillage (CT) are complements – GT crops provide more efficient post-emergent weed control, which potentially reduces the need for tillage.
- However, previous research has been inconclusive on whether GT crops complement CT for two reasons:
  - A lack of longitudinal, farm-level data.
  - Previously employed empirical frameworks do not distinguish between true complementarity and the correlation induced by unobservable factors (e.g., farmer education).

## Objectives

- In this paper we address the limitations of existing studies by:
- Developing a structural discrete choice framework of joint soybean-tillage adoption.
  - Applying our model to a large, unbalanced farm-level dataset that covers the 1998-2011 period.

Importantly, we allow unobserved returns across tillage and seed practices to be correlated. This allows us to explicitly identify whether GT soybeans and CT are complements.

**Figure 1: Conservation Tillage and GT Soybean Adoption Rates in the US**



## Model Basics

- We develop a mixed logit discrete choice model of joint soybean-tillage adoption.
- Each grower chooses the soybean-tillage system with the greatest per acre return.
- The choice set consists of four soybean-tillage systems :
  - Conventional Soybeans and Intensive Tillage (CV,IT)
  - Glyphosate Tolerant Soybeans and Intensive Tillage (GT,IT)
  - Conventional Soybeans and Conservation Tillage (CV,CT)
  - Glyphosate Tolerant Soybeans and Conservation Tillage (GT,CT)

## Empirical Framework

The latent, per-acre returns to each system for grower  $i$  at time  $t$  on field  $f$  are specified as:

$$\pi_{itf}(CV, IT) = 0$$

$$\pi_{itf}(GT, IT) = x_{itf}'\beta^{GT} + v_i^{GT} + \varepsilon_{itf}^{GT}$$

$$\pi_{itf}(CV, CT) = z_{itf}'\beta^{CT} + v_i^{CT} + \varepsilon_{itf}^{CT}$$

$$\pi_{itf}(GT, CT) = \pi_{itf}(GT, IT) + \pi_{itf}(CV, CT) + \gamma + \xi_{itf}$$

- $x_{itf}$  and  $z_{itf}$  are vectors of factors that affect the per acre returns to GT soybeans and CT (e.g., farm size).
- $(v_i^{GT}, v_i^{CT}) \sim N(0, \Sigma)$
- $\varepsilon_{itf}^{GT}$ ,  $\varepsilon_{itf}^{CT}$ , and  $\xi_{itf}$  are mean zero, IID Gumbel

## Theory of Complementarity

To test for whether GT Soybeans and CT are complements we rely on the theory of supermodularity, which states that the two practices complement if

$$\gamma \equiv [\pi(GT, CT) - \pi(GT, IT)] - [\pi(CV, CT) - \pi(CV, IT)] \geq 0.$$

That is, GT soybeans and CT are complements if the increase in returns from using CT with GT soybeans exceeds the increase in returns from using CT with CV soybeans.

## Empirical Test for Complementarity

From the empirical framework

$$\gamma + \xi_{itf} = [\pi_{itf}(GT, CT) - \pi_{itf}(GT, IT)] - [\pi_{itf}(CV, CT) - \pi_{itf}(CV, IT)] - \pi_{itf}(CV, IT)$$

- Since  $E[\xi_{itf}] = 0$ ,  $\gamma$  measures mean complementarity.
- If  $\gamma > 0$ , GT soybeans and CT are, on average, complements.

## Data

- We employ farm-level seed and tillage data from the survey company GfK.
- In total, our sample contains 82,056 farm-field-year observations across 235 crop reporting districts in 31 states. In any given year, about 43% of sampled growers are re-sampled the next year.
- The seed and tillage data are supplemented with data on soil erodibility (source: NRI), drought severity (source: NCDL), fuel prices (source: USDA-NASS), and soybean futures prices (source: CBOT).

**Table 1: System shares for U.S. Soybean Growers (percent of total observations).**

System	1998-2001	2002-2006	2007-2011	1998-2011
(CV,IT)	20.73	6.34	2.26	10.18
(GT,IT)	21.53	30.41	29.38	27
(CV,CT)	20.3	6.63	3.01	10.35
(GT,CT)	37.44	56.61	65.34	52.47

**Table 2: Simulated Maximum Likelihood Results. GT Soybean variable estimates represent their impact on GT soybean adoption. CT variable estimates represent their impact on conservation tillage adoption.**

Variables	Coefficient	Standard Error
GT Soybean Variables:		
Seed Price	-0.3271***	(0.01480)
Herbicide Price	-0.9733***	(0.14272)
Farm Size	0.1184***	(0.02992)
Trend	0.4427***	(0.00717)
CT Variables:		
Farm Size	0.2861***	(0.03090)
Fuel Price	0.0126***	(0.00100)
Palmer Drought Index	-0.0193***	(0.00447)
Erodibility Index	0.0787***	(0.00430)
Complementarity Estimate:		
$\gamma$	0.5106***	(0.02948)

Notes: \*\*\*Significant at 1%. \*\*Significant at 5%.

**Table 3: Conservation Tillage Predicted Adoption Rates. This table provides predicted share results from simulating adoption rates without GT soybeans included in the choice set.**

Period	With GT Option	Without GT Option	Difference
1998-2000	56.8	52.65	4.15
2001-2003	59.96	53.97	5.99
2004-2007	64.91	58.31	6.60
2008-2011	67.75	60.94	6.82

Notes: values are in percent of total soybean acres.

## Conclusions

- GT soybeans and Conservation Tillage are, on average, complementary practices ( $\gamma > 0$  and highly significant).
- Conservation Tillage adoption rates have been higher by as much 10% (7 percentage points) as a result of the availability of GT soybeans.
- Larger farms are more likely to adopt both GT soybeans and CT.
- Drought-like conditions, greater erodibility, and higher fuel prices are associated with a greater likelihood of adopting CT.