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Innovation propensity of Tunisian firms: the central role of external knowledge sources

Mohieddine Rahmouni, Mohamed Ayadi, Murat Yıldızoğlu

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- Following the accession of Tunisia to the GATT (1990), to the WTO (1996) and to a Free Trade Union with E.U. (1995)
- → Industry and innovation policies to foster competitiveness of Tunisian firms
 - The *Upgrade Program* (1995)
 - The first Law on Research and Technological Development (1996)

- 2005: the first (and only) innovation survey carried out in this country,
 - by the Ministry of Scientific Research, Technology and Competency Development (MSRTCD, 2005)
 - based on the Community Innovation Surveys (**CIS**) methodology.
- → A photography of innovation in manufacturing sectors after a decade of effort to enhance the technological development in Tunisia

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- **Our objective:** Analyzing the characteristics of innovative manufacturing firms in a developing country (Tunisia)
- Starting from a survey of other articles on the innovation processes in developing countries,
- and the economics of innovation,

- An econometric and statistical analysis of the survey, using mainly
 - Probit estimations to qualify the global relations between the characteristics of the firms and their propensity to innovate,
 - and non-parametrical regression trees to analyze the interactions between these characteristics (complementarity/substitution)
 - (We also check our econometric model for sampling problems (selection bias) and sensitivity towards unobserved heterogeneity)

Remarks

- Relative rarity of CIS surveys on developing countries
- Necessity of a broader definition of innovations
- Innovation: introducing better products and processes that are **new for the Tunisian firms**, without being necessarily new at the international level.
- → Including all firms that rely on the introduction of novelty to face the market competition and demand.

Literature

- We survey 31 papers that analyze innovation processes in developing countries
- The main common determinants of innovation that arise from this survey can be summarized in the following table:

Innov. type	Size	R&D	PartForeign	Export	Collaboration	Sector
Prod.	++,0	+++	+,00	+,0	++	Yes
Proc.	+++	+++	+,0	+,0	++, -	Yes

Legend: for $x \in \{+, 0, -\}$, x : more than 25% of studies; xx : more than 50%; xxx : more than 75%.

Research questions

- 1 Motivations of firms to innovate? Do product and process innovations obey to similar motivations?
- 2 Characteristics of innovating firms? And, more specifically
 - 1 Role of exportations
 - 2 and of different external knowledge sources in the innovativeness of the firms

Main results 1/2

- Motivations of firms significantly differ between product and process innovations
- external knowledge sources play a prominent role in the propensity to innovate (for both types of innovation, but differently)
- firms must benefit from at least one type of these sources to attain a significant innovation propensity
- internal R&D plays a role only for product innovations

Main results 2/2

- export orientation is not significant in itself but,
- serving both foreign and domestic markets plays a positive role in product innovations
- firm size plays a positive role for both type of innovations
- and the participation of the State a negative role
- sectoral effects are negligible (a yet immature sectoral innovation system?)
- →Globally, the profile of Tunisian firms differ from the countries analyzed in other articles

Our data set 1/3

- First innovation survey (CIS type) in Tunisia, by the MSRTCD
→ firms innovation activity from 2002 to 2004.
- Objective: to cover the maximum of firms likely to have an innovative and/or R&D activity
 - manufacturing firms with high technological intensity and/or strong added value;
 - firms having manpower higher than 10 people;
 - firms filed by the Industry Promotion Agency and the National Institute of the Statistics.
 - → Sampling bias and heterogeneity problems (checked in the paper)
- 739 firms → 586 firms answered the survey (79%).

Our data set 2/3

- Many [Yes/No] type questions → binary variables
- Innovation questions have this type: "Have you introduced a new product or process during the three years preceding the survey [Y/N]?"
- Several shortcomings: many qualitative variables, subjective questions difficult to interpret, etc., common to all CIS surveys, but also some specific ones.
- → Only one year of survey (not repeated yet); no data on the intensity of innovations; some questions propose items difficult to interpret; etc.
- No possibility of causal or dynamic analysis
- Table 1 in the paper gives the summary of the innovation variables.

Our data set 3/3

Proportion of innovators in the database

Variable	All firms	
	mean	sd
innovall	0.61	0.49
innovproc	0.49	0.50
innovprod	0.41	0.49
Observations	586	

- Global relationship between characteristics of the firms, knowledge source (explanatory variables), and firms' innovative capacity
- → **Probit estimations** → a simple **baseline model** where the binary dependent variable is *innovprod/innovproc/innovall*, and the explanatory variables are:
 - Usual suspects: Internal R&D department; firm size (sales)
 - + export behavior (*multiMarket* = 1 → the firm serves both the domestic and foreign markets)
 - + participation of the State to the capital of firms
 - + channels of external technical knowledge: Universities; technical agencies; public research centers; other firms; national and international organisms

Probit results, Part 1/2: Firm characteristics

(bold coefficient/(*) → significant at 5%)

	Prod. innov.	Proc. innov.
R&D dept.	0.47(*) (3.64)	0.23 (1.79)
log(Sales)	0.08(*) (2.06)	0.12(*) (3.34)
multiMarkets	0.34(*) (2.59)	0.10 (0.75)
partState	-0.01(*) (-3.74)	-0.01(*) (-2.65)

The *z* – values are given below coefficients, between parentheses.

Remarks:

- ◆ Serving both domestic and foreign markets favors only product innovations
- ◆ State's role is clearly negative for both types of innovation
- ◆ Internal R&D is necessary only for product innovations

Probit results, Part 2/2: External knowledge channels

	Prod. innov.	Proc. innov.
collUniv.	0.57 (*) (2.60)	0.24 (1.15)
collRecCent	-0.25 (-0.95)	-0.11 (-0.44)
collLabUnit	-0.27 (-1.12)	-0.37 (-1.62)
collNatOrg	0.26 (1.54)	0.51 (*) (2.99)
collInternatOrg	0.87 (*) (4.33)	0.57 (*) (2.86)
collOtherFirms	0.29 (1.54)	0.30 (1.61)
consultTech	0.49 (*) (3.84)	0.64 (*) (5.09)
constant	-2.21 (*) (-3.74)	-2.45 (*) (-4.39)
Nb. obs.	538	538
Pseudo R^2	0.19	0.15

Remarks:

- ◆ Technical consultants, international organizations → both types of innovations,
- ◆ Collaboration with national organizations → only for process innovations
- ◆ Collaboration with universities → only for product innovations.

- We also test more complete models including the foreign participation (not significant) and sectors (negligible significance). The results of bi-variate Probit estimations are also given.
- The rest of the paper
 - tries to shed more light on the content of the collaborations and
 - analyzes the interactions between these variables

Text based variable about the object of the collaborations (very partial, only 86 answers)

Universities (<i>Prod.</i>)	Resolution of technical problems for the firm (Ph.D. and master theses)
National organizations (<i>Proc.</i>)	Technical assistance Certification Training Improving quality Product and process update

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International organizations (<i>Both</i>)	Certification (ISO and others) Training Main branch of the society Design of products Technical assistance Foreign partners Marketing of patents
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Collaborations with universities



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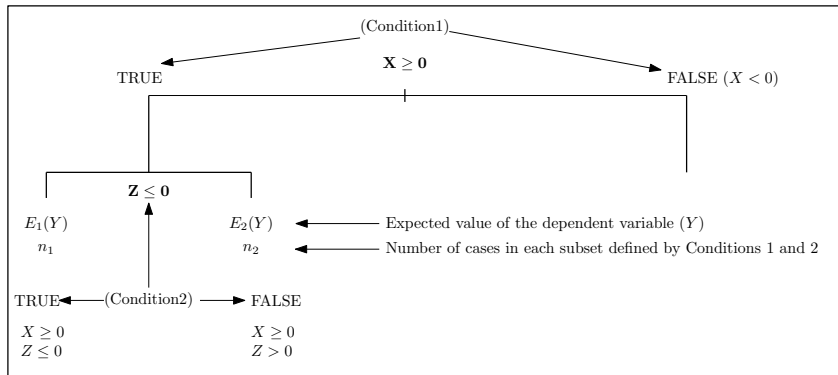
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Collaborations with other firms



Interpreting regression trees

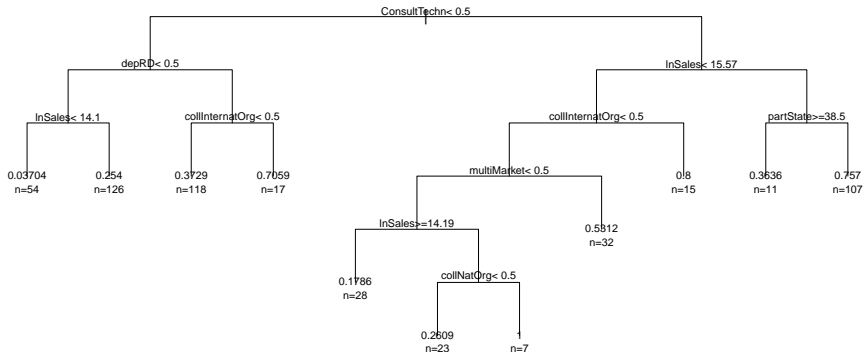
One dependent variable (Y) and two explanatory variables (Z, X):



- Regression trees → analysis of complementary/substitutable interactions between variables.
- Hierarchical relation between variables.
- ($cp = 1\%$)

Product innovations 1/3

Determinants of product innovations – All firms



Product innovations 2/3

Two sets of conditions are favorable to product innovations

- For the biggest firms:

$$\left. \begin{array}{l} \text{consultTechn} = 1 \\ \log(\text{Sales}) \geq 15.57 \\ \text{partState} < 38.5\% \end{array} \right\} \Rightarrow E(P[\text{innovProd}]) = 0.76, n = 107.$$

- and for smaller ones:

$$\left. \begin{array}{l} \text{consultTechn} = 1 \\ \log(\text{Sales}) < 15.57 \\ \text{collInternatOrg} = 1 \end{array} \right\} \Rightarrow E(P[\text{innovProd}]) = 0.80, n = 15.$$

Product innovations 3/3

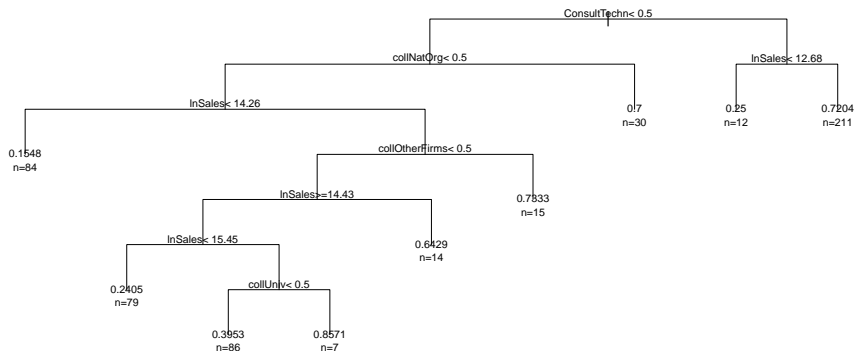
- Internal R&D plays an important role only for firms that do not appeal to external consultants.

$$\left. \begin{array}{l} \text{consultTechn} = 0 \\ \text{depRD} = 1 \end{array} \right\} \Rightarrow E(P[\text{innovProd}]) = 0.71, n = 180.$$

- External technical consultants play the most prominent role
- → their intervention is necessary (but not sufficient) to attain the highest propensities to innovate.

Process innovations 1/2

Determinants of process innovations – All firms



Process innovations 2/2

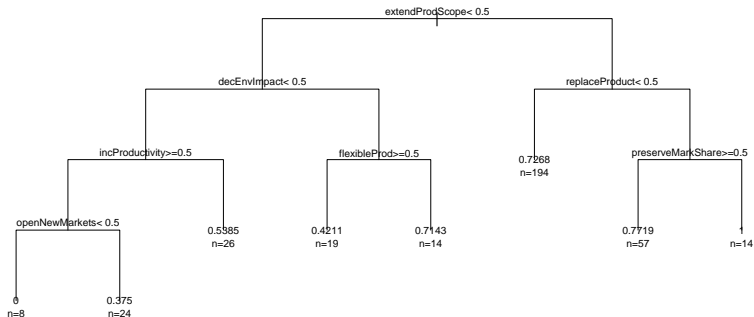
- Size and external knowledge sources are the only elements connected to process innovations.
- External technical consultants play again the most prominent role
- 211 large firms that appeal to technical consultants are able to attain a high innovative propensity

$$\left. \begin{array}{l} \text{consultTechn} = 1 \\ \log(\text{Sales}) > 12.68 \end{array} \right\} \Rightarrow E(P[\text{innovProc}]) = 0.72, n = 211.$$

- We also observe some substitution between sources of knowledge when $\text{consultTechn} = 0$.
- Large firms can compensate it's absence by collaborating with national organizations ($E[P] = 0.7$), other firms ($E[P] = 0.73$) or universities ($E[P] = 0.86$).

Motivations of Product innovations

Motivations for product innovations – Innovating firms



The most favorable set of motivations:

$$\left. \begin{array}{l} \text{extendProductScope} = 1 \\ \text{replaceProduct} = 1 \\ \text{preserveMarkShare} = 0 \end{array} \right\} \Rightarrow E(P[\text{innovProd}]) = 1, n = 14.$$

→ Proactive product strategy (Coherent!)

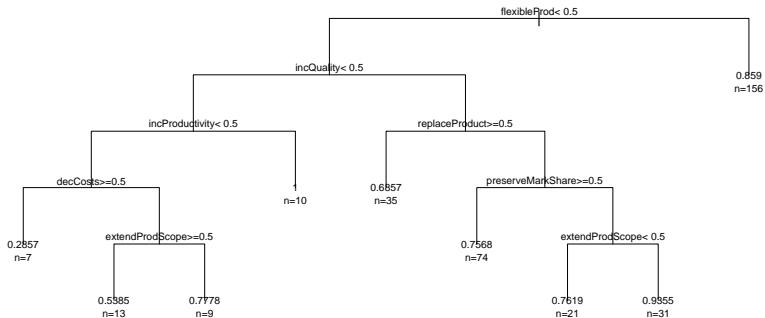
The most unfavorable one:

$$\left. \begin{array}{l} \text{extendProdScope} = 0 \\ \text{decEnvImpact} = 0 \\ \text{incProductivity} = 1 \\ \text{openNewMarkets} = 0 \end{array} \right\} \Rightarrow E(P[\text{innovProd}]) = 0, n = 8.$$

→ Process oriented defensive strategy (→ Motivations more favorable to process innovations?)

Motivations of Process innovations

Motivations for process innovations – Innovating firms



Effectively.

The most favorable set of motivations for process innovations is based on productivity increases:

$$\left. \begin{array}{l} \text{flexibleProduct} = 0 \\ \text{incQuality} = 0 \\ \text{incProductivity} = 1 \end{array} \right\} \Rightarrow E(P[\text{innovProc}]) = 1, n = 10.$$

The next favorable set → complementarity between process innovations and proactive product innovations:

$$\left. \begin{array}{l} \text{flexibleProduct} = 0 \\ \text{incQuality} = \mathbf{1} \\ \text{replaceProduct} = 0 \\ \text{preserveMarkShare} = 0 \\ \text{extendProdScope} = \mathbf{1} \end{array} \right\} \Rightarrow E(P[\text{innovProc}]) = 0.94, n = 31.$$

Except in this last case → Product and process innovations obey different motivations.

Differentiated analysis of their determinants.

Checking for sampling problems and heterogeneity

- Selection bias:
 - Survey-Weighted Probit Regression (number of observations in the sample drawn from that sector divided by the number of observations in the population of the sector, as observed in 2004.
- Unobserved heterogeneity:
 - Robust standard error (RSE) estimations
 - Markov chain Monte Carlo Probit regression
- Our baseline model stays robust in the face of these corrections.