

# The Growth and Volatility of French Exporters

A. Berthou and V. Vicard  
Banque de France

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# Motivations

## Importance of firms' heterogeneity in international trade

- Cross-sectional distribution of exporters' size :
  - Sales and exports are extremely concentrated among a limited number of very large firms
  - Large number of small exporters ship one or few goods to a neighboring destination (EKK, 2004)
- Dynamics : entry/exit
  - New exporters are small and have low rate of survival (Eaton et al. 2007 ; Freund and Pierola, 2010)
  - Surviving exporters grow faster (Eaton et al., 2007), especially on their first market (Albornoz et al, 2012)

# Motivations

Experience (or “age”) and size are central variables in the modeling of firm dynamics in domestic and foreign markets (Arkolakis, 2011 ; Luttmer, 2007)

- With Markov process, current size is a good prediction of future size (Hopenhayn, 1992)
- Learning emphasizes the role of age (Jovanovic, 1982)

Knowing whether age / size (or both) matter w.r.t. firms growth is a theoretical question that requires empirical investigation

# Objective of the paper

- Provide new empirical evidence regarding the determinants of firms dynamics in the export market
- Combined effect of age and size on exports growth
- Address several important statistical issues
- Focus on (1) survival (2) net growth conditional on survival (3) gross contributions of the intensive and extensive margins (volatility/churning)

# How do we address this question ?

- Methodology borrows from IO literature (Dunne et al. 1989 ; Davis and Haltiwanger 1992 among others)
- Detailed trade data at firm/product/destination
- Non-parametric estimations using export experience (age) and total exports value (size) as explanatory variables

## Statistical issues :

- Bias in measurement of growth rate in years of entry/exit
- Average size vs initial size  $\Rightarrow$  regression to the mean effects

## Preview of the main results

- **The net growth of exports for surv. firms is decreasing with firm experience in foreign markets**  
⇒ Confirms previous findings but high growth rate in first year is considerably reduced once growth rate in 2nd year is properly measured
- **No relationship between net growth of surv. firms and average size when controlling for export experience**  
⇒ Gibrat's law holds for export activity
- **Churning (gross contributions of entry and exit) decreases with both average size and export experience**  
⇒ Young and small exporters have more volatile trade relationships

# Road Map

- Methodology to compute growth rate of firm-level exports
- Presentation of the French data (firm-destination-product)
- Econometric strategy taking into account age and size of exporters
- Presentation of the main results for age/size of exporters in relation with net exports growth
- Additional results using gross export margins as dependent variable
- Concluding remarks

# I. Methodology and data



## Firm-level exports data

Monthly individual French exports 1994-2008 (French Customs).

- About 100,000 individual firms export in a given year
- of which 20,000 new exporters each year
- Monthly exports value by firm-destination-product(HS6)

Experience of exporters :

- Define 7 age-class of exporters (experience), 1-6 years for new exporters, 7+ for mature ones
- Firm considered as 'new' exporter if it did not export in the past 7 years (data start in 1994, and the first cohort is 2001)
- Re-entry is not allowed : one spell per firm
- Mature exporters have more than 6 consecutive years of experience

## Methodology : growth rate

Net growth of exports at firm level from individual export flows  
 ( $x_{ijkt}$ ) : firm  $i$ , country  $j$ , product  $k$ , year  $t$

$$G_{it} = \sum_{jk} \omega_{ijkt} \times g_{ijkt}$$

$$g_{ijkt} = \frac{x_{ijkt} - x_{ijkt-1}}{\frac{1}{2}(x_{ijkt} + x_{ijkt-1})}$$

$$\omega_{ijkt} = \frac{x_{ijkt} + x_{ijkt-1}}{\sum_{jk} x_{ijkt} + \sum_{jk} x_{ijkt-1}}$$

- ⇒ Accounts for possibility of entry and exit ;
- ⇒ Good approximation of the log first difference around zero ;
- ⇒ bounded between the values of entry and exit, 2 and  $-2$ .

## Methodology : growth rate

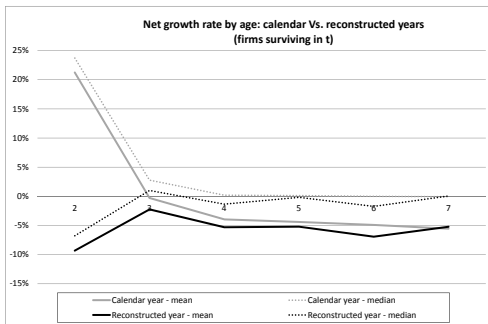
- Contributions of intensive/extensive margins :

$$G_{it} = G_t^I + G_{it}^{E+} + G_{it}^{E-} \text{ where } \begin{cases} G_{it}^{E+} & = \sum_{jk} \omega_{ijkt}^s \times g_{ijkt} & \text{if } g_{ijkt} = 2 \\ G_{it}^{E-} & = \sum_{jk} \omega_{ijkt}^s \times g_{ijkt} & \text{if } g_{ijkt} = -2 \\ G_{it}^I & = \sum_{jk} \omega_{ijkt}^s \times g_{ijkt} & \text{otherwise,} \end{cases} \quad (1)$$

- Can be refined with respective contributions of products, destinations, or both (in paper)

## Methodology : growth rate in 1st year

Important bias due to the 1st year of entry using calendar years



## Methodology : firm size

### Size of exporters :

- Estimations subject to regression to the mean effects when using base year in  $t-1$  to measure exporter's size
- Total exports averaged over  $t - 1$  and  $t$  to mitigate this bias
  - Correction similar to more sophisticated dynamic methodology developed by the US Bureau of Labor Statistics (Davies et al., 1996 ; Haltiwanger et al., 2010).
- Compare results based on alternative definitions (initial vs average size).

## II. Econometric analysis

### Econometric strategy

## Estimation methodology

Non parametric methodology :

$$G_{it} = \sum_{m=1}^6 \beta_m \text{age}_{mit} + \sum_{n=1}^9 \beta_n \text{size}_{nit} + \gamma_k + \gamma_t + \epsilon_{ijkt}$$

- firm size classes  $n$  : deciles of firm size
- age classes  $m$  : 1-6 and 7+
- Reference categories :
  - age  $\Rightarrow$  mature exporters (age = 7+)
  - size  $\Rightarrow$  large exporters (10th decile)
- industry (HS2) fixed effects
- year fixed effects.

## Reporting of estimation results

Predicted growth of firms' exports computed using the estimated coefficient for each category ( $n$  or  $m$ ) and the average growth of the reference category ( $\text{age} \geq 7$  or  $\text{size} = 10$ )

$$\widehat{G}_{it}(\text{Size} = n) = \overline{G}_{it}(\text{Size} = 10) + \hat{\beta}_n$$

$$\widehat{G}_{it}(\text{Age} = m) = \overline{G}_{it}(\text{Age} \geq 7) + \hat{\alpha}_m$$

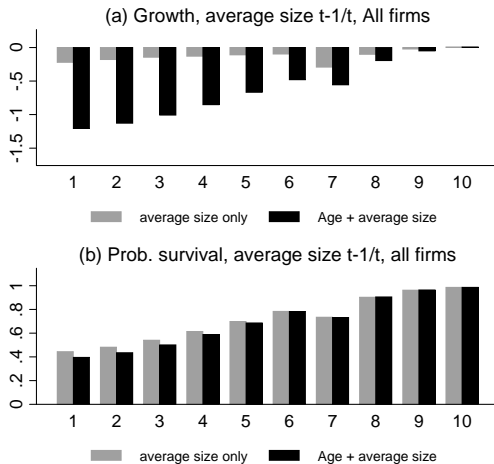
⇒ Results are summarized in graphs



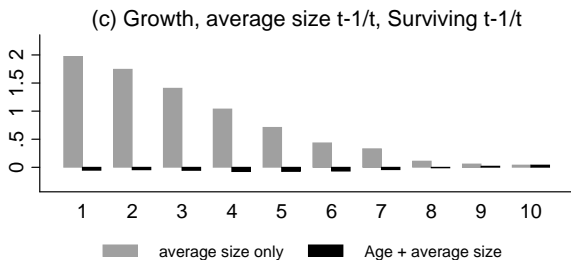
## II. Econometric analysis

Net growth of exports

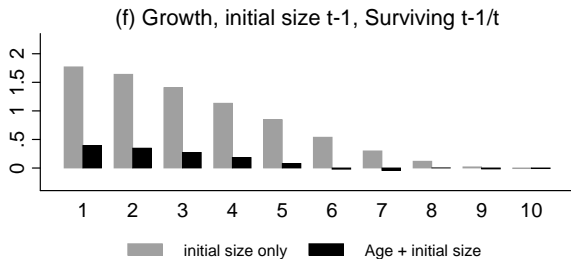
# Average size and net growth of exports



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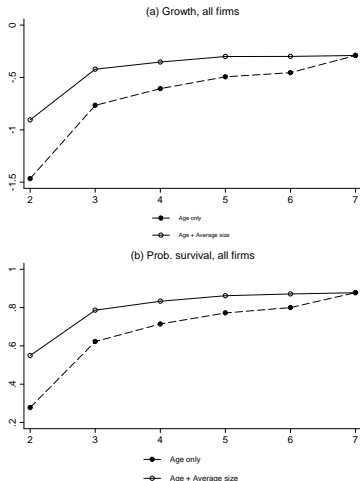


## initial size and net growth of exports

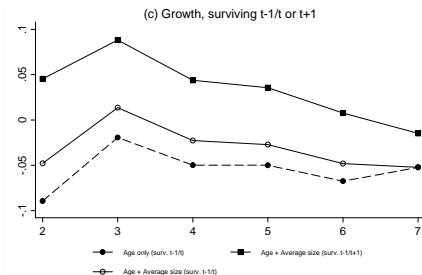


⇒ Growth decreases with initial size due to regression to the mean effects

# Export experience and net growth of exports



# Export experience and net growth of exports



## Summary of findings

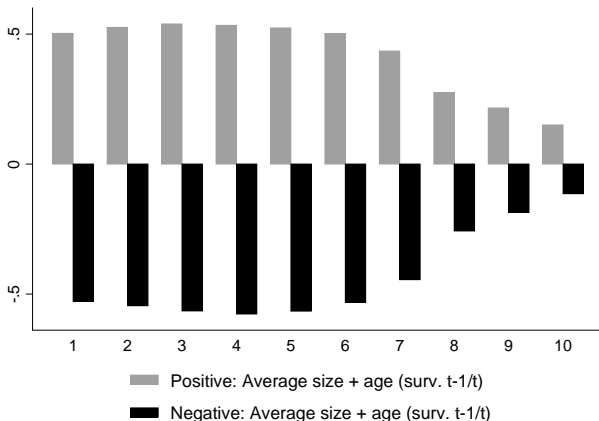
- Rate of survival is increasing with experience in foreign market and exporter size
- No relation between exporter size and net growth of surviving firms if the estimation controls for the age  
⇒ Gibrat's law holds in the export market
- Net growth of surviving exporters decreasing with export experience

## II. Econometric analysis

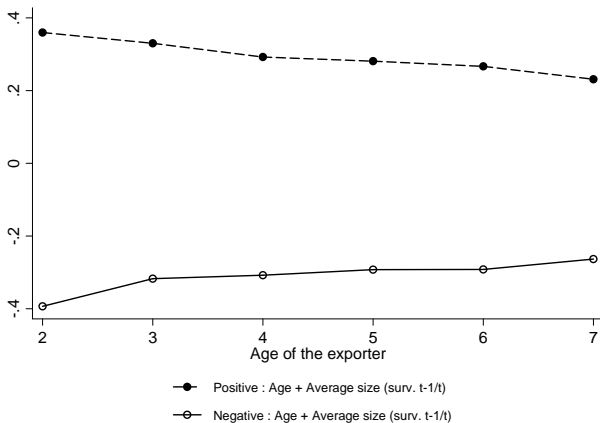
Gross exports margins (churning) conditional on survival



## Average size and the **gross margins** of firm-level exports



# Experience and the **gross margins** of firm-level exports



### **III. Summary of findings and concluding remarks**

## Summary and conclusions

Empirical evidence that experience matters for exporters' net growth, controlling for their size :

- survival rate increases with age, although less when controlling for average size
- Net growth conditional on survival is negatively related to experience
- Consistent with the existence of learning in export activity

Gibrat's law verified in the export market when considering net growth of surviving exporters

## Summary and conclusions

Volatility in foreign markets is decreasing with size (and to a lower extent with age)

- Large exporters have more stable trade relationships, conditional on survival
- To a lower extent, mature exporters have also more stable trade relationships  
⇒ also consistent with learning/matching stories