

# Export Market Risk and the Role of State Credit Guarantees

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Policy instrument aimed at mitigating financing constraints of exporters

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Declared objectives

- support export and employment

⇒ Existing literature suggests positive effects exists

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- ⇒ cost advantage
- bargaining power in debt renegotiations
- coordination cost
  - ⇒ comparative advantage in asserting claims

## Aim of this paper

Try to understand *why* the instruments works

- does it indeed mitigate financial constraints?
- if yes, what kind of constraints?



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Try to understand *why* the instruments works

- does it indeed mitigate financial constraints?
- if yes, what kind of constraints?

How we approach this question:

- write down a small theoretical model of heterogeneous exporters and financial market imperfections (Manova,2013)
- derive predictions on how and what kind of firms would benefit from public guarantees given the hypothesized cost advantage exists
- confront the predictions with data on firm level

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Note: these conclusions rely on the assumption that long-run profits of the public agency are really non-negative



## Related literature

### Banks as providers of (costly) liquidity

- bank runs (Diamond and Dybvig, 1983)
- diversification cost, buffer stocks, cash (Kashyap et al., 2002), cost of equity

### Role for government in financial markets

- Diamond and Dybvig (1983): lender of last resort
- Holmström and Tirole (1998): auditing and enforcement

### Public export credit guarantees

- Moser et al. (2008), Felbermayr and Yalcin (2011), Felbermayr et al. (2012) (Germany); Egger and Url (2006), Badinger and Url (2013) (Austria); Janda et al. (2012) (Czech Republic); Auboin and Engemann (2012)
- Abraham and Dewit (2000); Dewit (2001)

### Credit constraints and exports, trade finance ...

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Firms can purchase credit guarantees to mitigate credit default risk

# The financial sector

Banks:

- perfect competition, risk neutrality
- banks are obliged to neutralize risk in their balance sheet: cost  $c^B \in [0, (\bar{R} - 1)/\bar{R}]$  per unit of value at risk
- gross refinancing rate  $\bar{R} \geq 1$



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$\Rightarrow$  project-specific interest rate from no-arbitrage condition:

$$R^B := R[\lambda, \bar{R}, c^B, b^B]$$

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Guarantors:

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$\Rightarrow$  project-specific insurance premium from no-arbitrage condition:

$$\gamma := \gamma[\lambda, \bar{R}, b^G, c^G]$$

# Firms' export decision

Optimal sales for financing mode  $i \in (B, G)$ :

$$r^*[a]^i = \left( \frac{\theta}{aR^i} \right)^{-(1-\varepsilon)} A \quad \text{with}$$

$$R^B := R^B[\lambda, B] = \frac{\bar{R}}{\rho^B} \quad \text{with} \quad \rho^B = \lambda + (1 - \lambda)b^B - \bar{R}c^B(1 - \lambda)(1 - b^B)$$

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$$\pi^*[a] = \frac{\lambda}{\varepsilon} r^*[a] - \lambda R^i(f - k) - \bar{R}k = 0$$

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If  $b^B = b^G$ ,  $c^B = c^G$ , then  $R^B = R^G$ , and sales and the productivity threshold are identical under both schemes

# Theoretical results and testable hypotheses

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The effect should be more pronounced

- for small firms
- for large contracts and firms with little working capital
- if refinancing conditions are tight

## Data:

- Euler-Hermes transaction level data 2000-2010 (size, duration, risk category of importer, destination country)
- Ifo Business survey data (monthly assessment of stock of foreign orders, production constraint, employment, demand, export expectation)
- Amadeus yearly balance sheet data
- Thompson/Reuters interbanking rate

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<i>Observations</i>	210370
<i>Firms</i>	3964
<i>Guarantees</i>	872

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## Empirical strategy: Logit model

### Dependent variable:

- stock of foreign orders  $y_{it} \in \begin{cases} 1 & \text{"larger than usual"} \\ 0 & \text{"as usual" or "too small"} \end{cases}$

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$$\Pr(y_{it} = 1) = \Lambda(\beta_{1k} FinCon_{it}^k + \beta_2 Hermes_{it} + \beta_2^k Hermes_{it} \times FinCon_{it}^k + \beta_3' \mathbf{X}_{it} + \gamma_t + \gamma_i + \varepsilon_{it})$$

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where

- $\mathbf{X}_{it} = \{ \text{Demand}_{it}, \text{Constraint}_i, \overline{\ln \text{Employment}_i} \}$
- $\text{FinCon}^k \in \left\{ \begin{array}{l} \text{FirmSize}_{it}, \text{IBrate}_t, \ln \text{Working cap.}_{it}, \ln \text{Cash flow}_{it}, \\ \ln \text{Tangibles}, \ln \text{Contract size}_{it}, \text{Guarantor}_{it} \end{array} \right\}$
- $\text{Hermes}_{it} \in \{ \text{Hermes}_{it}(0, 1); \ln \text{EZD}_{it} \}$



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$$\alpha_i = \begin{cases} \text{fixed effect (conditional logit)} \\ \bar{X}_i' \omega & \text{(Mundlak random effects)} \end{cases}$$

# Baseline estimations

Dep. variable: <i>Stock of foreign orders</i>									
Model:	Mundlak-Chamberlain Probit				OProbit	Clogit	LPM	APE	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
<i>Hermes</i>	0.300*** (.0269)	0.293*** (.0302)	0.318*** (.0324)	0.0866** (.0405)		0.100* (.055)	0.259*** (.0811)	0.0270 (.0205)	0.0122** (.00571)
<i>ExpectExp</i> (-)	-0.290*** (.0174)	-0.138*** (.0233)	-0.131*** (.0265)	-0.138*** (.0234)	-0.138*** (.0234)	-0.721*** (.0209)	-0.371*** (.0556)	-0.00549** (.00225)	-0.0171*** (.0027)
<i>ExpectExp</i> (+)	0.615*** (.00787)	0.306*** (.0123)	0.283*** (.0142)	0.309*** (.0125)	0.309*** (.0125)	0.280*** (.0156)	0.656*** (.0252)	0.0666*** (.00367)	0.0487*** (.00217)
<i>Demand</i> (-)	-0.355*** (.0119)	-0.263*** (.0147)	-0.267*** (.0167)	-0.247*** (.0147)	-0.247*** (.0147)	-0.527*** (.0139)	-0.689*** (.0349)	-0.0251*** (.0018)	-0.0296*** (.00162)
<i>Demand</i> (+)	0.417*** (.00798)	0.299*** (.0107)	0.296*** (.0123)	0.278*** (.0108)	0.278*** (.0108)	0.422*** (.0133)	0.655*** (.0231)	0.0527*** (.00282)	0.0444*** (.00185)
<i>avg. Unconstrained</i>	0.0701*** (.0124)	-0.00109 (.0155)	-0.0278 (.0178)	-0.0283* (.0156)	-0.0290* (.0156)	1.182*** (.0177)			-0.00399* (.0022)
<i>avg. ln Emp</i>	0.0470*** (.00225)	0.0396*** (.00274)	0.0285*** (.00309)	0.0366*** (.00277)	0.0364*** (.00277)	0.135*** (.00315)			0.00516*** (.00039)
<i>avg. ExpectExp</i>				-0.124*** (.0263)	-0.124*** (.0263)	-0.271*** (.0303)			-0.0174*** (.00371)
<i>avg. Demand</i>				0.492*** (.0307)	0.491*** (.0307)	0.837*** (.0349)			0.0693*** (.00432)
<i>avg. Hermes</i>				0.524*** (.0639)		0.298*** (.0899)			0.0739*** (.00901)
<i>ln ContractSize</i>					0.00688** (.00299)				
<i>avg. ln ContractSize</i>					0.0384*** (.00462)				
# lags	0	6	12	6	6	6	6	6	6
N	290113	210258	168076	210258	210258	210244	137940	211063	210258
(Pseudo) R <sup>2</sup>	.20	.45	.57	.45	.45	.19	.21	.13	

# Interaction effects

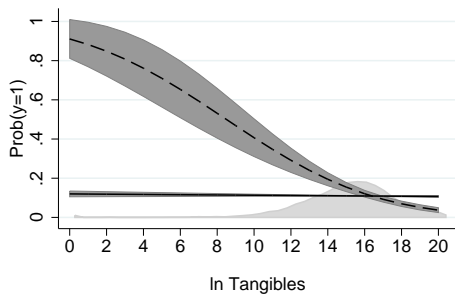
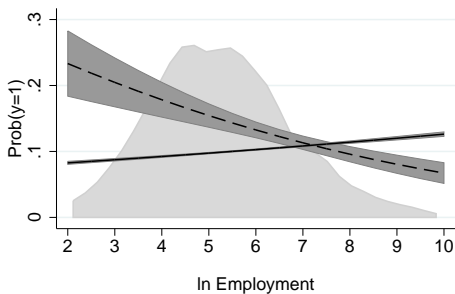
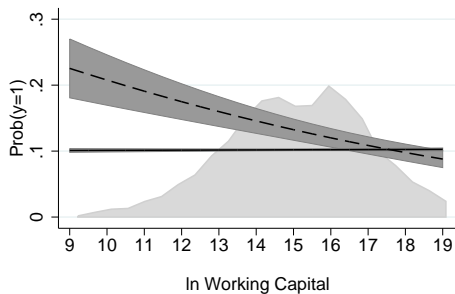
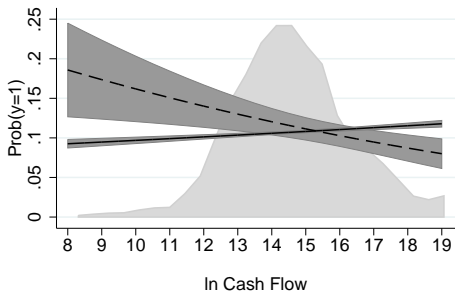
Table: Interaction Terms, Coefficient Estimates

Dependent variable: <i>Stock of foreign orders</i>						
	Model: Mundlak-Chamberlain Probit					
	(1)	(2)	(3)	(4)	(5)	(6)
<i>Hermes</i>	1.102*** (0.167)	-0.491*** (.0946)	1.204*** (0.228)	1.131*** (0.336)	3.106*** (0.456)	
× <i>ln Emp</i>	-0.152*** (0.0244)					
× <i>lbrate</i>		0.184*** (.026)				
× <i>avg. ln WorkingCap</i>			-0.0683*** (0.0133)			
× <i>avg. ln CashFlow</i>				-0.0739*** (.0215)		
× <i>ln Tangibles</i>					-0.189*** (0.0276)	
<i>ln ContractSize</i>						-0.0761*** (.0192)
× <i>ln ContractSize</i>						0.00596*** (.00135)
N	210258	210258	114209	92989	65352	210258
Pseudo R <sup>2</sup>	.45	.45	.70	.75	.82	.45

Estimations are based on the specification in previous table, Column 4. Robust standard errors in parenthesis. \*, \*\*, \*\*\* indicate significance on the 10, 5, and 1% significance level. Coefficients of lagged variables, firm averages (except for direct effects of interacted variables), time and sector FE not shown.

# Predicted probabilities $\Pr(y = 1)$

--- Hermes=1      — Hermes=0



## Type of importer's guarantor

Table: Type of the Importer's Guarantor

	$\hat{\Pr}(y = 1 X)$	90% CI	# obs
<i>Hermes</i> = 0	<b>.102</b>	[.101;.103]	207712
<i>Hermes</i> = 1			
<i>State</i>	<b>.079</b>	[.045;.112]	59
<i>Bank</i>	<b>.121</b>	[.095;.148]	199
<i>Private</i>	<b>.164</b>	[.138;.191]	361
<i>None</i>	<b>.105</b>	[.095;.116]	2695

Predicted probabilities. 90% confidence bounds in parenthesis.

## Robustness and open issues

We find qualitatively similar results

- using a continuous measure of *Hermes*
- using different number of lags of our covariates
- including qualitative covariates as indicator variables and medians instead of means
- for ordered logit

# Summary and conclusion

We find a positive effect of Hermes guarantees on exports

- that is stronger for financially vulnerable firms
- for smaller firms
- for larger contracts
- in times where refinancing cost of banks are high

We read this as evidence for the hypothesis that the government has a cost advantage in financing very risky projects, in particular so if financing conditions on private markets are tight

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## Interaction of the Hermes effect

Interpretation of and inference on interaction terms in non-linear models is not straightforward (Ai and Norton, 2003; Greene, 2010)

- ⇒ the sign of  $\hat{\beta}_{1k}$  is not indicative for the sign of the change in the marginal effect of Hermes
- ⇒  $\beta_k = \beta_{1k} = 0$  is sufficient but not necessary for the effect to be zero, various combinations of estimated parameters and the data can equate  $\frac{\partial DC_{j,D_{it}}}{\partial x_{kit}} = 0$ , irrespective of  $\beta_k, \beta_{1k}$ .

To interpret interaction terms and assess significance, Greene and Henscher (2010) suggest to look at predicted probabilities at different values of the covariates.

## Marginal effects and interaction terms

Marginal effect (discrete change in probability of  $y = j$ ) of Hermes:

$$DC_{j,D_{it}} = \Lambda(\tau_j - \delta' Z_{it} | D_{it} = 1) - \Lambda(\tau_{j-1} - \delta' Z_{it} | D_{it} = 1) \\ - \Lambda(\tau_j - \delta' Z_{it} | D_{it} = 0) + \Lambda(\tau_{j-1} - \delta' Z_{it} | D_{it} = 0)$$

The change in the marginal effect of Hermes when a continuous variables  $x_{kit}$  changes is

$$\frac{\partial DC_{j,D_{it}}}{\partial x_{kit}} = (\beta_k + \beta_{1k}) [f(\tau_{j-1} - \delta' Z_{it} | D_{it} = 1) - f(\tau_j - \delta' Z_{it} | D_{it} = 1)] \\ - \beta_k [f(\tau_{j-1} - \delta' Z_{it} | D_{it} = 0) + f(\tau_j - \delta' Z_{it} | D_{it} = 0)]$$