

Export Market Risk and the Role of State Credit Guarantees

Inga Heiland* Erdal Yalcin**

*Ifo Institute

**Ifo Institute, CESifo

**7th FIW-Research Conference
International Economics**

December 12-13, 2014

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

- firms pay insurance premium for export transaction

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

- firms pay insurance premium for export transaction
- the guarantor pays in case of default of the importer and assumes the claim

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

- firms pay insurance premium for export transaction
- the guarantor pays in case of default of the importer and assumes the claim
- gains and losses enter the government budget

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

- firms pay insurance premium for export transaction
- the guarantor pays in case of default of the importer and assumes the claim
- gains and losses enter the government budget

Between 2000-2010, annually guarantees worth 16-32 bn Euro were extended

Public export credit guarantees in Germany

"Hermes coverage"

Policy instrument aimed at mitigating financing constraints of exporters

- firms pay insurance premium for export transaction
- the guarantor pays in case of default of the importer and assumes the claim
- gains and losses enter the government budget

Between 2000-2010, annually guarantees worth 16-32 bn Euro were extended

Declared objectives

- support export and employment

⇒ Existing literature suggests positive effects exists

Motivation

Does the government finance projects with neg. expected values?

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

- deep pocket, risk neutrality of the government

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

- deep pocket, risk neutrality of the government
 - cumulative gains hide large heterogeneity in annual results

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

- deep pocket, risk neutrality of the government
 - cumulative gains hide large heterogeneity in annual results
- ⇒ cost advantage

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

- deep pocket, risk neutrality of the government
 - cumulative gains hide large heterogeneity in annual results
 - ⇒ cost advantage
- bargaining power in debt renegotiations

Motivation

Does the government finance projects with neg. expected values?

⇒ cumulative gains of the agency 1954-2010 are positive
(\approx 2 bn Euro)

Why does the market not provide this insurance?

- deep pocket, risk neutrality of the government
 - cumulative gains hide large heterogeneity in annual results
 - ⇒ 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?

Aim of this paper

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

Preview of results

We find positive effects on exports,

Preview of results

- We find positive effects on exports, that are stronger
- for financially more vulnerable firms

Preview of results

We find positive effects on exports, that are stronger

- for financially more vulnerable firms
- for larger values at risk

Preview of results

We find positive effects on exports, that are stronger

- for financially more vulnerable firms
- for larger values at risk
- in times of tight conditions on private capital markets

Preview of results

We find positive effects on exports, that are stronger

- for financially more vulnerable firms
- for larger values at risk
- in times of tight conditions on private capital markets

This lends support to our hypothesis that the

- instrument mitigates financial market imperfections

Preview of results

We find positive effects on exports, that are stronger

- for financially more vulnerable firms
- for larger values at risk
- in times of tight conditions on private capital markets

This lends support to our hypothesis that the

- instrument mitigates financial market imperfections
- the government has cost advantages in financing specific types of projects

Preview of results

We find positive effects on exports, that are stronger

- for financially more vulnerable firms
- for larger values at risk
- in times of tight conditions on private capital markets

This lends support to our hypothesis that the

- instrument mitigates financial market imperfections
- the government has cost advantages in financing specific types of projects

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 ...

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

External finance dependence (following Manova, 2013):

- firms have to pay fixed and variable production cost for export $\tau a q[a] + f$ upfront

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

External finance dependence (following Manova, 2013):

- firms have to pay fixed and variable production cost for export $\tau a q[a] + f$ upfront
- firms can borrow from a perfectly competitive banking sector $(f - k)$

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

External finance dependence (following Manova, 2013):

- firms have to pay fixed and variable production cost for export $\tau a q[a] + f$ upfront
- firms can borrow from a perfectly competitive banking sector $(f - k)$

Risky export claims (following Feenstra et al., 2011)

- export revenues are risky, claims $p[a]q[a]$ only can be asserted with probability λ

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

External finance dependence (following Manova, 2013):

- firms have to pay fixed and variable production cost for export $\tau a q[a] + f$ upfront
- firms can borrow from a perfectly competitive banking sector $(f - k)$

Risky export claims (following Feenstra et al., 2011)

- export revenues are risky, claims $p[a]q[a]$ only can be asserted with probability λ
- if importer defaults, exporter cannot repay the loan

The theoretical model: Assumptions

One sector Melitz (2003)-type open economy:

- partial equilibrium, representative importing and exporting country

External finance dependence (following Manova, 2013):

- firms have to pay fixed and variable production cost for export $\tau a q[a] + f$ upfront
- firms can borrow from a perfectly competitive banking sector $(f - k)$

Risky export claims (following Feenstra et al., 2011)

- export revenues are risky, claims $p[a]q[a]$ only can be asserted with probability λ
- if importer defaults, exporter cannot repay the loan

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 $\bar{R} \geq 1$

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 $\bar{R} \geq 1$
- recovery rate $b^B \in [0, 1]$ in case of default

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 $\bar{R} \geq 1$
- recovery rate $b^B \in [0, 1]$ in case of default

⇒ project-specific interest rate from no-arbitrage condition:

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

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 $\bar{R} \geq 1$
- recovery rate $b^B \in [0, 1]$ in case of default

⇒ project-specific interest rate from no-arbitrage condition:

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

Guarantors:

- offer guarantee for a premium γ per unit
- facing financing conditions \bar{R}, b^G, c^G

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 $\bar{R} \geq 1$
- recovery rate $b^B \in [0, 1]$ in case of default

⇒ project-specific interest rate from no-arbitrage condition:

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

Guarantors:

- offer guarantee for a premium γ per unit
- facing financing conditions \bar{R}, b^G, c^G

⇒ 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 $i \in (B, G)$:

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

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

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

Firms' export decision

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

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

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

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

Threshold productivity $1/a$ for each financing mode determined by

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

Firms' export decision

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

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

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

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

Threshold productivity $1/a$ for each financing mode determined by

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

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

Theoretical results: Suppose firms have chosen the profit maximizing financing mode.

Theoretical results and testable hypotheses

Theoretical results: Suppose firms have chosen the profit maximizing financing mode. Then, a decrease in R^i due to a decrease in c^i or an increase in b^i

- (i) increases export sales
- (ii) decreases the threshold productivity. This effect is c.p. relevant for small firms.

Theoretical results and testable hypotheses

Theoretical results: Suppose firms have chosen the profit maximizing financing mode. Then, a decrease in R^i due to a decrease in c^i or an increase in b^i

- (i) increases export sales
- (ii) decreases the threshold productivity. This effect is c.p. relevant for small firms.

The effect of lower c or higher b is particularly strong

- (i) for large values at risk (k is small)
- (ii) if refinancing cost \bar{R} are high.

Theoretical results and testable hypotheses

Theoretical results: Suppose firms have chosen the profit maximizing financing mode. Then, a decrease in R^i due to a decrease in c^i or an increase in b^i

- (i) increases export sales
- (ii) decreases the threshold productivity. This effect is c.p. relevant for small firms.

The effect of lower c or higher b is particularly strong

- (i) for large values at risk (k is small)
- (ii) if refinancing cost \bar{R} are high.

Testable hypotheses: The use of credit guarantees provided by a public agency that faces lower diversification cost c or a higher recovery rate b
-leads to more exports

Theoretical results and testable hypotheses

Theoretical results: Suppose firms have chosen the profit maximizing financing mode. Then, a decrease in R^i due to a decrease in c^i or an increase in b^i

- (i) increases export sales
- (ii) decreases the threshold productivity. This effect is c.p. relevant for small firms.

The effect of lower c or higher b is particularly strong

- (i) for large values at risk (k is small)
- (ii) if refinancing cost \bar{R} are high.

Testable hypotheses: The use of credit guarantees provided by a public agency that faces lower diversification cost c or a higher recovery rate b
-leads to more exports

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

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

Empirical strategy: Logit model

Dependent variable:

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

Empirical strategy: Logit model

Dependent variable:

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

Logit model:

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

Empirical strategy: Logit model

Dependent variable:

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

Logit model:

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

where

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

Empirical strategy: Logit model

Dependent variable:

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

Logit model:

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

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

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)
avg. <i>Unconstrained</i>	0.0701*** (.0124)	-0.00109 (.0155)	-0.0278 (.0178)	-0.0283* (.0156)	-0.0290* (.0156)	1.182*** (.0177)			-0.00399* (.0022)
avg. <i>ln Emp</i>	0.0470*** (.00225)	0.0396*** (.00274)	0.0285*** (.00309)	0.0366*** (.00277)	0.0364*** (.00277)	0.135*** (.00315)			0.00516*** (.00039)
avg. <i>ExpectExp</i>				-0.124*** (.0263)	-0.124*** (.0263)	-0.271*** (.0303)			-0.0174*** (.00371)
avg. <i>Demand</i>				0.492*** (.0307)	0.491*** (.0307)	0.837*** (.0349)			0.0693*** (.00432)
avg. <i>Hermes</i>				0.524*** (.0639)		0.298*** (.0899)			0.0739*** (.00901)
<i>ln ContractSize</i>					0.00688** (.00299)				
avg. <i>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 ²	.20	.45	.57	.45	.45	.19	.21	.13	

Interaction effects

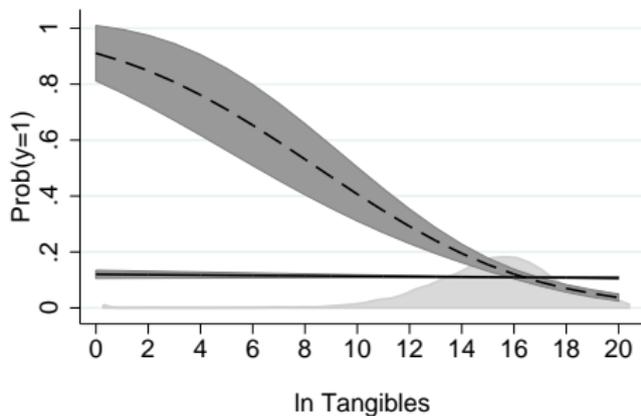
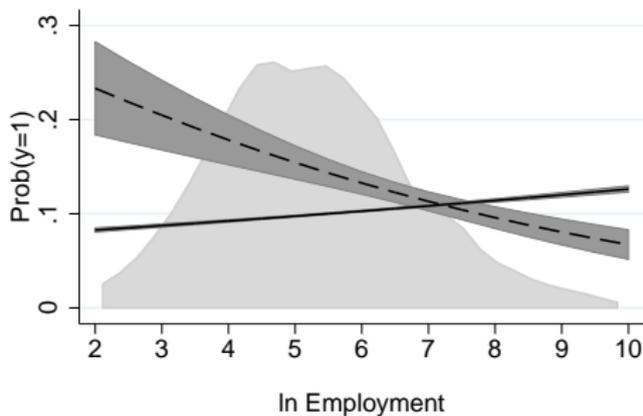
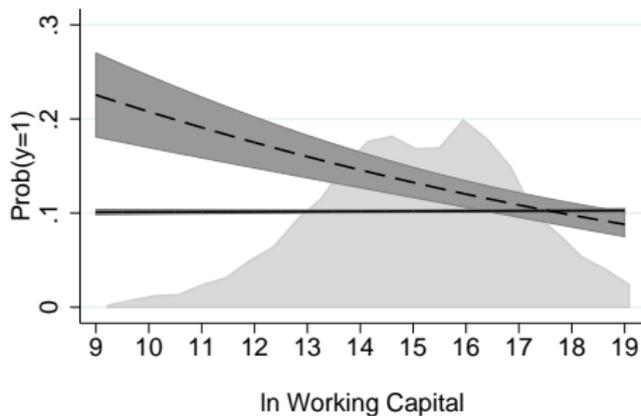
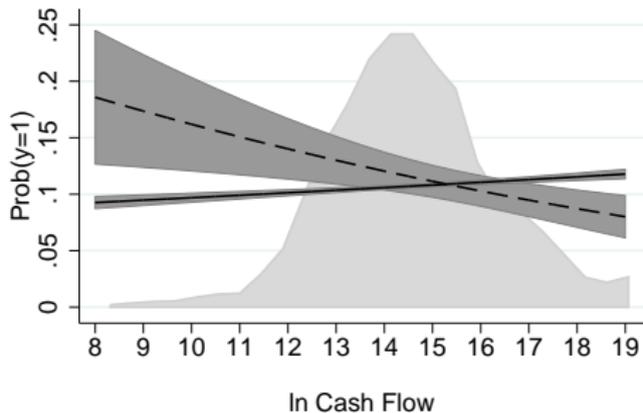
Table: Interaction Terms, Coefficient Estimates

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>Ibrate</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 ²	.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	.102	[.101;.103]	207712
<i>Hermes</i> = 1			
<i>State</i>	.079	[.045;.112]	59
<i>Bank</i>	.121	[.095;.148]	199
<i>Private</i>	.164	[.138;.191]	361
<i>None</i>	.105	[.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

- Abraham, F. and Dewit, G. (2000). Export Promotion Via Official Export Insurance. *Open Economies Review*, 11(1):5–26.
- Ai, C. and Norton, E. C. (2003). Interaction terms in logit and probit models. *Economics Letters*, 80(1):123–129.
- Auboin, M. and Engemann, M. (2012). Testing the trade credit and trade link : evidence from data on export credit insurance. Staff working paper ERSD 2012-18, WTO.
- Dewit, G. (2001). Intervention in Risky Export Markets: Insurance, Strategic Action or Aid? *European Journal of Political Economy*, 17(3):575–592.
- Diamond, D. W. and Dybvig, P. H. (1983). Bank runs, deposit insurance, and liquidity. *Journal of Political Economy*, 91(3):pp. 401–419.
- Egger, P. and Url, T. (2006). Public export credit guarantees and foreign trade structure: Evidence from Austria. *The World Economy*, 29(4):399–418.
- Feenstra, R. C., Li, Z., and Yu, M. (2011). Exports and Credit Constraints Under Incomplete Information: Theory and Evidence from China. NBER Working Papers 16940, National Bureau of Economic Research, Inc.
- Felbermayr, G. and Yalcin, E. (2011). Export credit guarantees and export performance: An empirical analysis for Germany. ifo Working Paper 116, ifo institute for economic research.
- Felbermayr, G. J., Heiland, I., and Yalcin, E. (2012). Mitigating Liquidity Constraints: Public Export Credit Guarantees in Germany. CESifo Working Paper Series 3908, CESifo Group Munich.
- Greene, W. (2010). Testing hypotheses about interaction terms in nonlinear models. *Economics Letters*, 107(2):291–296.
- Greene, W. and Henscher, D. (2010). *Modelling Ordered Choices: A Primer*. Cambridge University Press, New York.
- Holmström, B. and Tirole, J. (1998). Private and public supply of liquidity. *Journal of Political Economy*, 106(1):pp. 1–40.
- Janda, K., Michalkov, E., and Skuhrovec, J. (2012). Credit Support for Export: Econometric Evidence from the Czech Republic. Working Papers IES 2012/12, Charles University Prague, Faculty of Social Sciences, Institute of Economic Studies.
- Kashyap, A. K., Rajan, R., and Stein, J. C. (2002). Banks as Liquidity Providers: An Explanation for the Coexistence of Lending and Deposit-Taking. *The Journal of Finance*, 57(1):pp. 33–73.
- Manova, K. (2013). Credit Constraints, Heterogeneous Firms, and International Trade. *The Review of Economic Studies*, 80(2):711–744.
- Melitz, M. J. (2003). The Impact of Trade on Intra-Industry Reallocations and Aggregate Industry Productivity. *Econometrica*, 71(6):1695–1725.
- Moser, C., Nestmann, T., and Wedow, M. (2008). Political risk and export promotion: Evidence from Germany. *The World Economy*, 31(6):781–803.

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 β_k, β_{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

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