

Austrian Exporters: A Firm-Level Analysis

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Vienna, August 2010

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This publication was produced in the framework of MICRO-DYN (www.micro-dyn.eu), an international economic research project focusing on the competitiveness of firms, regions and industries in the knowledge-based economy. The project is funded by the EU Sixth Framework Programme (www.cordis.lu) with socio-economic sciences and humanities (http://ec.europa.eu/research/social-sciences/index_en.html).

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Abstract

In this paper we provide detailed evidence on the importance and performance of exporters compared to non-exporters in Austrian manufacturing industries based on firm-level data. The centrepiece of the study is the issue of the export premium, i.e. the size and performance advantages of exporting firms compared to their purely domestic peers. We find evidence for the existence of large export premia for all seven size and performance premia considered. These results are largely in line with the results found for other European countries. When estimating the export premium at the level of individual industries, we find significant differences with respect to the magnitude of the export premia. Significant export premia are still found when controlling for other firm characteristics such as employment and R&D-related variables where we find lower but more plausible magnitudes for the size and performance premia of exporters. We further test the robustness of the export premium results using random and also fixed effects estimators. The random effects model delivers statistically significant export premia for all measures as well. Care has to be taken when interpreting the estimated coefficients in the firm fixed effects model as the coefficients signal differences in size and productivity for 'export switchers', i.e. firms changing their export status. Finally, we employ a probit model to investigate the impact of past firm characteristics on the probability to export. The major result is that while lagged firm productivity and size matter, the most important factor influencing this probability is the past export status pointing to a strong persistence of exporting.

JEL classification: F14, L25

Keywords: exports, firm heterogeneity, export premium, Austrian manufacturing firms

Austrian exporters: a firm-level analysis

1 Introduction

With the emergence of heterogeneous firm models (e.g. Melitz, 2003), trade theory has finally put firms, which are the major actors in the export business, in the centre of analysis, instead of countries or sectors. These models stress firm heterogeneity, which is typically modelled as (static) differences in productivity across firms. Trade models incorporating firm heterogeneity, however, do not replace the results of preceding trade models such as the new trade models developed by Krugman (1979) but rather build on them and add new elements. For example, models based on heterogeneous firms still use the established incentives for trade of existing models such as comparative advantages or product varieties. Additional elements come in as comparative advantages may be caused by additional factors and there are new sources of gains from trade, most importantly within-industry reallocations of market shares towards more efficient firms. Nevertheless, some major assumptions of existing theories are challenged. An important example in this context is the prediction of earlier models that there are only 'export sectors' (all firms export) and 'import competing sectors' (no firm exports) or, if industries both export and import, trade only takes place in differentiated goods and all firms export. In contrast, the Melitz model predicts that, depending on differences in productivities of firms and (fixed) trade costs, only a subset of firms *within* an industry engages in exporting. Certainly, the insight that an economy and also industries are not populated by identical firms is not exactly new and is well known from industrial economics and firm growth literature. What is relatively new, however, is the availability of firm-level data with sufficient information on international activities that allow researchers to investigate the consequences of firm heterogeneity for international trade. For example, in their seminal work Clerides, Lach and Tybout (1998) showed for Colombia, Mexico and Morocco that exporting firms indeed differ from non-exporting firms in many respects (such as in productivity, size, etc.). Bernard and Jensen (1999) analysed US firms and introduced a straightforward method to estimate the 'export premium', that is, the advantage of exporting over non-exporting firms in terms of size measures, productivity and other performance measures, which is also the subject of this paper.

With the growing availability of firm-level data sets, including information on international activities of firms such as exports, imports or foreign direct investment, a rich empirical literature on the internationalization and the role and behaviour of international firms has developed. For Austria, however, there is still hardly any evidence on these issues. Some first results on the characteristics of Austrian exporting firms have been presented in a recent comparative country study undertaken by the International Study Group on Exports and Productivity (ISGEP, 2008) and in 2009 a first detailed study on the characteristics of exporting versus non-exporting firms was published (Pöschl et al., 2009). Here we build on the results found in our earlier study and take a closer look at the export premia in Austrian

manufacturing over the period 2002-2006. In particular, we extend the estimation of the export premia in several ways to check the robustness of the estimations. Finally, we touch upon the issue of causality by estimating a probit model including lagged firm characteristics as factors influencing firms' probability of exporting.

A first extension with regard to the issue of the export premium is to estimate it at the level of individual industries (in our case mainly NACE subsections) in addition to the level of entire manufacturing. This extension is motivated by the fact that in the econometric specification of Bernard – Jensen (1999) for estimating the export premium, the inclusion of industry dummies may not sufficiently take into account industry differences. When regressing, say, labour productivity on the export status, the industry dummies capture differences in productivities across industries but the regression still forces a common coefficient on the export status, i.e. the export premia. The descriptive statistics presented at length in Pöschl et al. (2009) demonstrate, however, that the magnitude of the export premia for the different size and performance measures varies considerably across industries. We therefore make use of the large number of observations in our panel data set and estimate the export premium at the level of (broadly defined) industries. In addition to considerable variation of the export premia across industries we also find interesting differences with respect to export intensities of firms. When estimating the export premium for firms with different export intensities (export turnover as a share of total turnover), i.e. replacing the simple export status variable with dummy variables indicating the firms' 'export intensity group', we find that in some industries the difference between marginal exporting firms (e.g. export shares less than five per cent) and non-exporters are striking while in other industries only the most export-intensive firms differ significantly from non-exporting firms. A more substantial extension is the inclusion of additional control variables where we opted for a size variable (employment) and some variables related to research and development (R&D). This modification seems to remedy a lot of the existent omitted variable bias in the descriptive baseline regression that only includes industry and year dummies as control variables. The estimated export premia are now of a much smaller magnitude (17% for sales, 17.5% for labour productivity and 7.7% for wages). We see this as an important confirmation of our earlier results with more plausible magnitudes.

The panel structure of our data set also allow us to use a firm fixed effects and a random effects model to estimate the export premia but both approaches have drawbacks. While the latter yields statistically significant results it may suffer from inconsistency, and in the firm fixed effect model, the export status dummy in fact tests a different hypothesis which is not related to the export premium generally but to size and performance differences of switching firms, i.e. previously non-exporting firms that enter the export market. We nevertheless included these results as well because they still lend additional support to the existence of export premia. Finally, while the data do not allow to make a final judgement on the issue of causality between firm performance or size on the one hand and exporting on

the other, we touch upon this issue by the way of probit regressions including lagged firm characteristics.

The remainder of this paper is structured as follows: Section 2 gives a brief overview of related literature. Section 3 describes the data set which is used in Sections 4 and 5 to present the facts related to export activities, including export participation and export concentration in the Austrian manufacturing sector. Section 6 reports the results of various approaches to estimate the export premia while Section 7 contains the findings from our probit regression. Section 8 concludes.

2 Related literature

The seminal paper by Melitz (2003) on heterogeneous firms and trade provides a useful theoretical background for country studies on the role and characteristics of exporting firms. It suggests a clear relationship between exporting and productivity: since exporting is assumed to entail fixed exporting costs (and variable trade costs), only the more productive firms engage in export activities while less productive firms choose to serve the domestic market only. This self-selection process of more productive firms into exporting is confirmed by studies on the causal relationship between exporting and productivity, at least for developed countries.¹ The assumption of a constant price-cost mark-up in the model implies that the prices a firm charges and therefore its sales are directly related to the firm's productivity. We therefore expect exporters to be more productive and also larger than firms selling only on the domestic market.

Leaving aside the issue of causality, Bernard and Jensen (1999) propose a straightforward empirical equation to estimate the productivity and size advantages of exporting firms which became known as the 'export premium'. The approach consists simply of regressing performance measures (such as labour productivity, total factor productivity or wages paid to employees) and size measures (such as firm sales or employment) on the export status, which is a dummy variable taking on the value one if the firm has positive export sales. This regression set-up has been used for many country studies employing firm-level data to estimate the export premium. An overview of the results on the export premium for European (and some non-European) countries can be found in Mayer and Ottaviano (2007), Altomonte and Ottaviano (2008) and ISGEP (2008). Since the direction of causality is not clear *a priori*, it is equally possible to treat the export status as the dependent variable and regress it on a number of firm characteristics. This approach is more in line

¹ An alternative hypothesis on the self-selection of firms into export markets is that firms are learning from exporting so that exporting makes them more productive. An overriding majority of empirical studies tackling the issue of causality between exporting and productivity came to the conclusion that, at least for developed countries, the causality runs from productivity to exporting with only limited 'learning by exporting' effects (e.g. Arnold and Hussinger, 2005 for Germany). It is therefore not self-evident to use productivity measures (or size measures) as the dependent variable; it allows, however, to use simple OLS estimation techniques.

with the suggested self-selection process of the Melitz model. As the export status is a binary variable this requires the estimation of export probabilities and a switch of the estimation procedure. In the literature this is typically tackled by employing a probit model (for example Greenaway and Kneller, 2004; Kox and Rojas-Romagosa, 2010).

In this paper we estimate the export premia for Austrian manufacturing firms over the period 2002 to 2006, closely following Bernard and Jensen (1999). Our findings are fully in line with the findings of other country studies both for the existence of an export premium as well as other stylized facts, e.g. that a small number of firms account for the bulk of aggregate exports. We build on and extend our results on the export premium of our previous paper (Pöschl et al, 2009) by estimating the export premia at the individual industry level, and adding additional control variables such as research and development (R&D) indicators and more common factors such as employment (e.g. Greenaway and Kneller, 2004). A noticeable point in our fixed effects result is that the interpretation is different as outlined below. This is because the tested hypothesis with firm fixed effects included is whether export switchers differ significantly from non-exporting firms. So while our estimation approach is fully in line with previous work on export premia (e.g. Kox and Rojas-Romagosa, 2010; ISGEP, 2008), we provide an alternative interpretation. For analysing the influence of firm characteristics on the probability to export, we also opted for a probit model with our approach being similar to the one by Greenaway and Kneller (2004), who also include regional variables as controls and, most importantly, the lagged export status which reveals the persistence of exporting.

3 Data

In this paper we use Austrian firm-level data provided by Statistics Austria via 'remote execute'.² The basic data set is the 'Leistungs- und Strukturhebung' for the period 1997-2006 and NACE categories C to F; in this paper, we only use data for the manufacturing sector (NACE D).³ There has been a methodological change in 2002 which we have to take into account.

These data provide firm-level information for a number of indicators on a yearly basis of which we use the number of firms in each manufacturing NACE 2-digit industry, production value, sales, employment, total investment and wages and salaries. Unfortunately these data do not provide information on the export behaviour of firms. For information on the

² We would like to thank Mag. Wally, who was invaluable in solving the administrative and juridical hurdles and problems in accessing the data at the first stage. We further thank ADir RR Mazanek, who provided assistance in setting up the database and the export markers in particular and a number of useful comments. Various other members of Statistics Austria have been helpful in processing the data and generating results.

³ Detailed information on definitions and methods are provided in 'Standard-Dokumentation: Metainformationen (Definitionen, Erläuterungen, Methoden, Qualität) zur Leistungs- und Strukturstatistik, Teilprojekt Produzierender Bereich', downloadable from www.statistik.at.

export status of firms the data from the 'Leistungs- und Strukturhebung' have to be combined with the 'Konjunkturstatistik'⁴, which is on a monthly basis, includes a smaller number of firms sampled and provides only few indicators. The 'Konjunkturstatistik', however, provides information on sales in the domestic economy and export sales. Using this information it was possible to generate indicators on the export status ('export markers'). These export markers allow to distinguish exporting firms according to their export intensity, that is, we can distinguish between firms exporting equal to or less than 5, 30, 50 and more than 50 per cent of their sales respectively.

This information on the export status was merged to the indicators taken from the 'Leistungs- und Strukturhebung'. As the sample size in the 'Konjunkturstatistik' is smaller than that in the 'Leistungs- und Strukturhebung' there remains a number of firms for which no information on their export status is available (see Table 1 below). Moreover, the reliance on the 'Konjunkturstatistik' for the export sales implies that we only have firms with 20 employees or more in our sample as this is the threshold for firms to be included in the 'Konjunkturstatistik'. Further, due to confidentiality issues, cells with less than 4 firms are not used in the results reported below.⁵

Throughout the paper we will take care of the fact that there is a break in the series due to a change in the data collection method of Statistics Austria, so we split the period 1997-2006 into two sub-periods, with period 1 ranging from 1997 to 2001 and period 2 ranging from 2002 to 2006, with most of the analysis focusing on the second period.

Table 1

Sample overview, manufacturing (NACE D), 1997-2006

Year	Total number of firms	Firms with exports status known	Exporters	Non-exporters	Share of exporters (%)
1997	9388	5342	2967	2375	55.54
1998	9531	5379	3045	2334	56.61
1999	9609	5106	2959	2147	57.95
2000	9421	5000	2931	2069	58.62
2001	9218	4952	2921	2031	58.99
2002	27572	5973	3218	2755	53.88
2003	28581	6054	3303	2751	54.56
2004	28609	5949	3340	2609	56.14
2005	28374	5719	3248	2471	56.79
2006	28712	6326	3537	2789	55.91

⁴ For details see 'Standard-Dokumentation: Metainformationen (Definitionen, Erläuterungen, Methoden, Qualität) zur Konjunkturstatistik im Produzierenden Bereich', downloadable from www.statistik.at.

⁵ Results dealing with only the *number* of firms but not their characteristics are not covered by this rule.

As Table 1 indicates, the total number of firms for which data are available tripled from the first to the second period due to the methodological change. However, the number of firms for which the export status is known increased by a much smaller amount, rising from roughly 5000 to roughly 6000 firms. Therefore, our actual sample, i.e. the number of firms for which information on the export status is available, varies from 4952 firms in 2001 to 6326 firms in 2006, the last year for which data are available to us.

For all calculations and results in this paper we chose the simplest (and also most widely used) definition of the export status. According to this definition, a firm is considered to be an exporter in any particular year if its export sales are greater than zero. This implies that individual firms can switch from being a non-exporter to being an exporter in the next year and vice versa. Hence, according to this definition firms that only export sporadically and in very low amounts also count as exporters.⁶

Neglecting the break in the time series, the share of exporters in our sample seems to be relatively constant over the entire period with roughly 56% both in 1997 and 2006. This, however, conceals an interim low in 2002 (53.88%) and a peak of 58.99% in the preceding year with the jump possibly caused by the break in the time series. Looking at the two time periods 1997-2001 and 2002-2006 separately, it appears that the number of exporting firms in the Austrian economy has been increasing only slightly over time. The unimpressive increase in the share of exporting firms between 2002 and 2006 was about 2 percentage points, which implies an annual increase in the share of exporters of less than 1%. In comparison, Austrian aggregate exports rose from EUR 77.4 billion to EUR 103.8 billion during the same period, an increase of more than one third or 7.6% annually, which may suggest that the expansion mostly occurred via an increased volume of exports by firms rather than an increase in the number of exporters.

4 Export participation and export intensity

4.1 Industry export participation

In this section we present descriptive evidence on the overall engagement of manufacturing firms in export activities and by individual industries for the period 2002-2006. Table 2 reports the number of firms and exporters together with the share of exporters in 2002 and 2006 for individual manufacturing industries (NACE 15-37) and total manufacturing. The figures suggest that the share of exporters in the total number of firms, i.e. the export participation rate, is rather high in most manufacturing industries. These shares are graphically presented in Figure 1 where we have ranked the industries by industry export participation in 2006. This shows that in 13 of the 23 industries the export

⁶ An alternative, narrower, definition of the export status is to consider a firm as an exporter only if it is exporting equal to or more than 5% of its sales in two consecutive years.

participation rate is above 80%. Industries with the lowest shares of exporters are the food and beverages industry (NACE 15) and non-metallic mineral products industry (NACE 26), not considering manufacturing n.e.c. (NACE 36). Given these industry-specific figures, the export participation in overall manufacturing is rather low, amounting to 56%. This is explained by the fact that some of the industries with the lowest export participation rates figure among those with the highest number of firms in our sample. In particular, these are the food and beverages industry (NACE 15) and the 'catch-all' industry manufactures not elsewhere classified (NACE 36). The former is the largest industry – in terms of the number of firms – and also the industry with the lowest export participation in 2006 (28%) (see Table 2).

Table 2

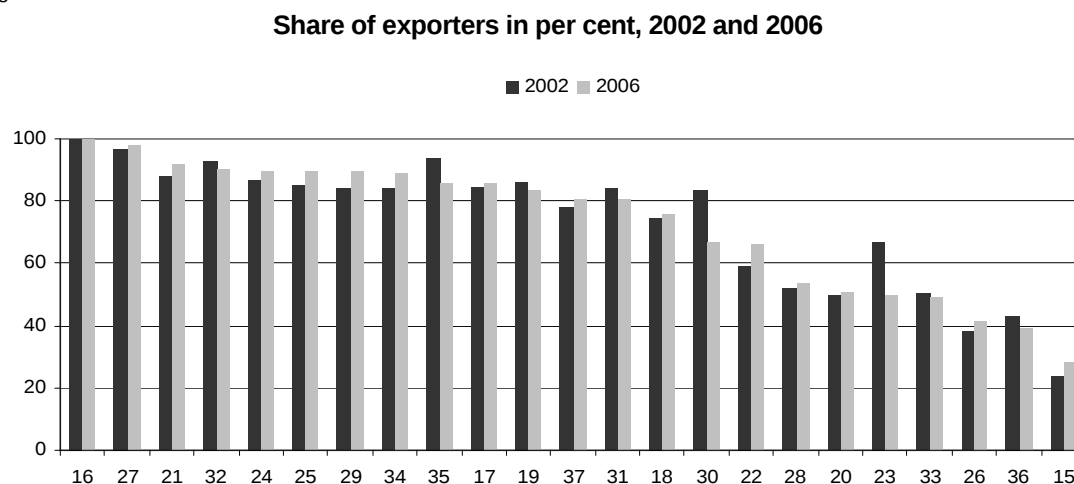
Number and relative share of exporters, 2002 and 2006

NACE	Industry	2002				2006			
		Non-exporter	Exporters	Total number of firms	Share of exporters	Non-exporter	Exporters	Total number of firms	Share of exporters
15	Food and beverages	900	278	1178	23.60	862	334	1196	27.93
16	Tobacco products	0	1	1	100.00	0	1	1	100.00
17	Textiles	25	135	160	84.38	21	123	144	85.42
18	Wearing apparel	25	73	98	74.49	20	62	82	75.61
19	Leather	5	31	36	86.11	4	20	24	83.33
20	Wood	273	273	546	50.00	296	308	604	50.99
21	Pulp and paper	10	73	83	87.95	7	75	82	91.46
22	Publishing and printing	169	245	414	59.18	152	300	452	66.37
23	Refined petroleum	1	2	3	66.67	2	2	4	50.00
24	Chemicals	15	100	115	86.96	13	114	127	89.76
25	Rubber and plastic products	33	191	224	85.27	23	200	223	89.69
26	Non-metallic mineral products	208	127	335	37.91	197	140	337	41.54
27	Basic metals	3	90	93	96.77	2	92	94	97.87
28	Fabricated metal products	429	461	890	51.80	487	568	1055	53.84
29	Machinery and equipment	86	460	546	84.25	56	483	539	89.61
30	Office machinery and computers	2	10	12	83.33	2	4	6	66.67
31	Electrical machinery	21	108	129	83.72	28	116	144	80.56
32	Radio, TV, communication	3	40	43	93.02	5	46	51	90.20
33	Precision & optical instruments	97	98	195	50.26	130	126	256	49.22
34	Motor vehicles	12	62	74	83.78	10	82	92	89.13
35	Other transport equipment	1	15	16	93.75	3	18	21	85.71
36	Manufactures n.e.c.	433	331	764	43.32	464	302	766	39.43
37	Recycling	4	14	18	77.78	5	21	26	80.77
15-37	Total manufacturing	2755	3218	5973	53.88	2789	3537	6326	55.91

In Figure 2 we present the change in shares between 2002 and 2006. The figure reveals that the (modest) manufacturing-wide rise in the share of exporters of 2 percentage points over the period 2002-2006 stretches across a number of industries, with shares rising to a varying extent however. The largest increases were observed in publishing and printing

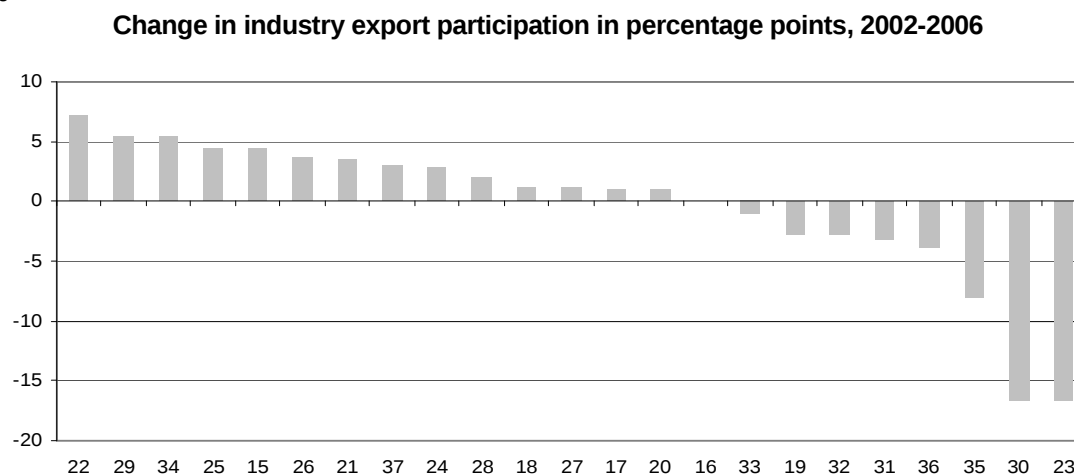
(NACE 22), the machinery and equipment industry (NACE 29) and the automotive industry (NACE 34). There are also a few industries with declining shares. These are in most cases industries with a relatively small number of firms, which also explains the rather large changes of the shares in percentage points.

Figure 1



Note: The numbers on the horizontal axis refer to the respective NACE industry (division).

Figure 2



Note: The numbers on the horizontal axis refer to the respective NACE industry (division).

4.2 Firm export intensity

In addition to export participation at the manufacturing and industry level, we are also interested in the export intensity of firms, that is, the share of sales that a firm is earning from exporting. Unfortunately we lack detailed information on the precise export sales of firms and therefore their export intensity. But for each firm we know the range of its export sales, which allows us to distinguish between five groups. The first group consists of the

non-exporters, whose export intensity is obviously zero ('none'). The second group includes exporters with exports up to 5% of their sales, and we label those as having 'marginal' export intensity or as 'marginal exporters'. Exporters with exports between 5% and 30% of total sales are considered to have 'low to medium' export intensity and form the third firm grouping. The fourth group indicates 'high export intensity' and covers all firms that generate more than 30% and up to 50% of their sales in export markets. Finally, for 'very high intensity' exporters this share is above 50%.

Table 3

Number of firms by export intensity and NACE industries, 2006

NACE	Industry	Non-exporters	Marginal	Low to medium	High	Very high	Total
15	Food and beverages	862	115	122	46	51	1196
16	Tobacco products	0	0	1	0	0	1
17	Textiles	21	7	21	23	72	144
18	Wearing apparel	20	3	22	14	23	82
19	Leather	4	3	2	1	14	24
20	Wood	296	54	89	52	113	604
21	Pulp and paper	7	7	14	11	43	82
22	Publishing and printing	152	141	117	18	24	452
23	Refined petroleum	2	0	1	1	0	4
24	Chemicals	13	8	26	15	65	127
25	Rubber and plastic products	23	13	58	34	95	223
26	Non-metallic mineral products	197	33	58	14	35	337
27	Basic metals	2	3	10	11	68	94
28	Fabricated metal products	487	146	198	78	146	1055
29	Machinery and equipment	56	43	84	58	298	539
30	Office machinery and computers	2	0	0	0	4	6
31	Electrical machinery	28	9	28	12	67	144
32	Radio, TV, communication	5	2	7	8	29	51
33	Precision & optical instruments	130	20	19	16	71	256
34	Motor vehicles	10	10	14	8	50	92
35	Other transport equipment	3	1	3	3	11	21
36	Manufactures n.e.c.	464	65	110	47	80	766
37	Recycling	5	1	3	2	15	26
15-37	Total manufacturing	2789	684	1007	472	1374	6326

Note: Export intensities are defined as follows: non-exporters = 'none'; >0% - 5% of turnover exported = 'marginal'; >5% - 30% of turnover exported = 'low to medium'; >30% - 50% of turnover exported = 'high'; >50% of turnover exported = 'very high'.

Table 3 provides an overview of the export intensities of Austrian manufacturing firms across industries. The table reveals that the pattern with respect to the export intensity is rather different across industries. In a sense, this is to be expected because the guidance provided by theory as to what pattern is likely if firms are grouped by export intensities is very limited and there is no unique pattern to be derived from analytical models.⁷ Rather, the distribution will depend on the size of the exporting country, comparative advantages (Bernard et al., 2007), the country's openness, the number and openness of its trading

⁷ For simulation results see, for example, Bernard et al. (2003) for the US or Del Gatto et al. (2007) for France.

partners, industry-specific trade costs and the differences in trade costs among trading partners. All these factors may vary widely from industry to industry within one country. Therefore these differences should not come as a surprise.

For manufacturing as a whole we find two major peaks at the opposite ends of the spectrum, i.e. the non-exporters (44%) and the firms with very high export intensity (22%).

This is an interesting observation and shows that, given the export activity of a firm, the average Austrian firm is likely to be highly engaged in exporting with over half of its revenues generated from export operations. This is shown more clearly in Table 4 reporting the relative distribution of exporting firms only along the four firm groupings. This way of presenting the data highlights the fact that a large fraction of exporting firms has very high export intensity, standing at 39% for the entire manufacturing sector and reaching 74% in the basic metals industry (NACE 27).

The picture that emerges for the entire manufacturing sector, however, is not really representative because it is heavily influenced by the food and beverages industry (NACE 15) which is dominated by non-exporters and, as already mentioned, is large in terms of the number of firms. The dominant pattern found across industries is one of a very large number of exporters with very high export intensity and a more or less evenly spread number of firms in all the other firm groupings. This pattern is discernible for a number of important industries in Austria such as machinery and equipment (NACE 29) or the motor vehicle industry (NACE 34), the chemical industry (NACE 24), the radio, TV, communication industry (NACE 32), the basic metals industry (NACE 27), the textile industry (NACE 17) and some more. How can we explain this pattern? The fact that the share of exporters is relatively high may be attributed to the fact that Austria is a small open economy. The more interesting aspect though is the concentration in the group of the very high intensity exporters. This we suppose has to do with the fact that Austria has a relatively large share of intra-EU exports (about 70%) which means that trade costs (apart from transport costs perhaps) are very similar for the different export markets. In other words, if a firm finds it profitable to export to country A, it is most likely to find it profitable to export to market B as well because of similar trade costs involved. Comparative advantages cannot fully explain the high number of exporters with very high export intensity because the industries which show this high export intensity pattern include both industries with comparative advantages as well as comparative disadvantages (as revealed by Austria's trade statistics).⁸ One factor that we cannot take into account for the lack of information is the impact of foreign direct investment (FDI) and foreign ownership on firms' export intensities. If foreign firms set up

⁸ The pattern would be consistent with the expected situation in comparative advantage industries in an environment with low trading costs. Resource reallocations induced by trade towards most productive firms are strongest in comparative advantage industries which lead to a situation where the domestic cut-off productivity level and the export productivity level move closer together, resulting in a high number of exporters (Bernard et al., 2007).

subsidiaries in Austria, these firms are supposed to be, on average, the most productive ones (Helpman et al., 2004).

Table 4

Firm export intensities, 2006, relative shares within group of exporting firms

NACE		Marginal	Low to medium	High	Very high
15	Food and beverages	34.4	36.5	13.8	15.3
16	Tobacco products	0.0	100.0	0.0	0.0
17	Textiles	5.7	17.1	18.7	58.5
18	Wearing apparel	4.8	35.5	22.6	37.1
19	Leather	15.0	10.0	5.0	70.0
20	Wood	17.5	28.9	16.9	36.7
21	Pulp and paper	9.3	18.7	14.7	57.3
22	Publishing and printing	47.0	39.0	6.0	8.0
23	Refined petroleum	0.0	50.0	50.0	0.0
24	Chemicals	7.0	22.8	13.2	57.0
25	Rubber and plastic products	6.5	29.0	17.0	47.5
26	Non-metallic mineral products	23.6	41.4	10.0	25.0
27	Basic metals	3.3	10.9	12.0	73.9
28	Fabricated metal products	25.7	34.9	13.7	25.7
29	Machinery and equipment	8.9	17.4	12.0	61.7
30	Office machinery and computers	0.0	0.0	0.0	100.0
31	Electrical machinery	7.8	24.1	10.3	57.8
32	Radio, TV, communication	4.4	15.2	17.4	63.0
33	Precision & optical instruments	15.9	15.1	12.7	56.4
34	Motor vehicles	12.2	17.1	9.8	61.0
35	Other transport equipment	5.6	16.7	16.7	61.1
36	Manufactures n.e.c.	21.5	36.4	15.6	26.5
37	Recycling	4.8	14.3	9.5	71.4
15-37	Total manufacturing	19.3	28.5	13.3	38.8

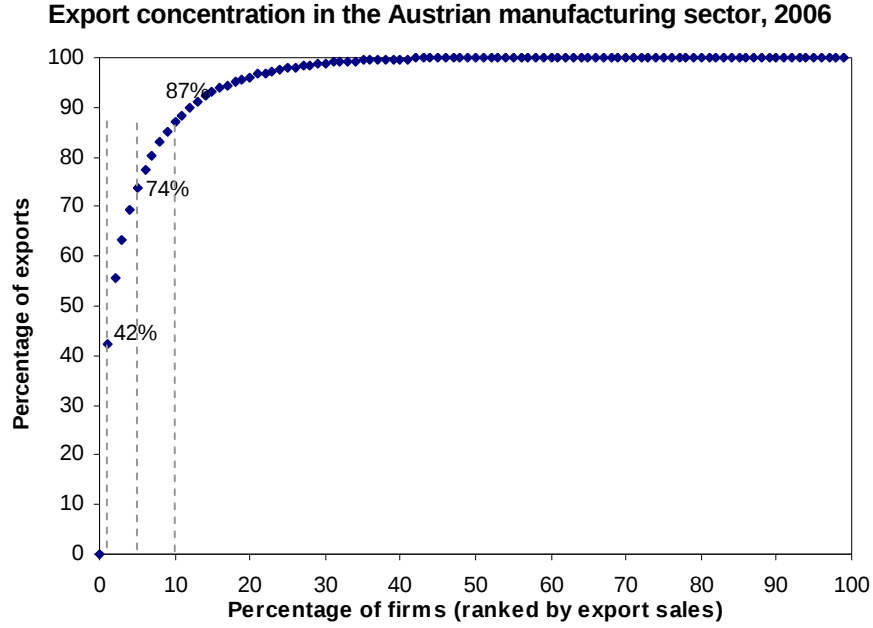
Note: Export intensities are defined as follows: non-exporters= 'none'; >0%-5% of turnover exported = 'marginal'; >5% - 30% of turnover exported = 'low to medium'; >30%-50% of turnover exported = 'high'; >50% of turnover exported = 'very high'

5 Export concentration

Despite the high export intensity of Austrian manufacturing firms that implies a large number of firms engaged in some exporting activity, it is nevertheless a rather small number of firms that account for the bulk of total exports. Lacking precise information on actual export sales of firms, we had to make assumptions about these export sales. We used information on firms' membership to the export intensity groups (non-exporter, marginal, low-to-medium, large and very large export intensity) and assumed that each exporter belonging to a particular group exports the average percentage of the upper and lower bound of the respective group. For example, each marginal exporter – which we know exports between 0% and 5% of its sales – is assumed to export 2.5% of its total sales and likewise for all other groups of firms.⁹

⁹ Calculations based on the upper and the lower bound of the bandwidth of the respective groups instead of averages only yield marginal differences. A better account of the export concentration could only be achieved by using the shares of exports in total sales which is not available to us.

Figure 3



Using this assumption we derived a proxy of Austrian manufacturing firms' export sales. We then rank firms by these export sales to arrive at the cumulative distribution function of aggregate manufacturing exports and calculate the export concentration in the manufacturing sector. The graph of the cumulative distribution function of exports (Figure 3) displays a steep increase at the beginning (exporters are ordered by export sales) and we find that the largest 1% of firms account for no less than 42% of exports in 2006. Moreover, the largest 5% and 10% make up 74% and 87% of total exports respectively.¹⁰

6 Export premium

6.1 Empirical strategy

Let us now turn to the question to which extent exporting firms differ from non-exporters. In our empirical strategy we closely follow the approach first employed by Bernard and Jensen (1999) which has since then been used intensively in empirical work on firm heterogeneity and trade. The basic idea is to regress a size or performance measure such as sales or labour productivity, in logarithmic form, on the export status represented by a dummy variable (ES) that takes the value 1 for exporting firms and 0 for non-exporters. At the level of manufacturing this regression – which we estimate by ordinary least squares (OLS) – takes the form

$$\ln Y = \iota \cdot \alpha + ES \cdot \beta + IND \cdot \gamma_{IND} + YEAR \cdot \delta + \varepsilon \quad (1)$$

where ES is a $NT \times 1$ matrix and β is the corresponding coefficient indicating the size of the export premium. The regression includes a set of dummy variables for individual industries,

¹⁰ In the calculation of the percentiles non-exporters are included.

IND , and time fixed-effect year dummies, $YEAR$, as controls. These dummies are included to control for the fact that the average firm is bigger and more productive in some sectors than in others and the business cycle respectively. $YEAR$ is a $NT \times T$ dimensional matrix and δ the corresponding vector of coefficients for the time fixed effects with dimension $T \times 1$. IND is a matrix with dimension $NT \times k$ where k indicates the number of industries and γ_{IND} is the corresponding vector of coefficients with dimension $k \times 1$. Finally, ε is an $NT \times 1$ vector containing the error terms.

As dependent variable we use alternatively the logarithm of different size and performance measures which are summarized by the $NT \times 1$ matrix $\ln Y$. The variables are firm sales, employment, the wage sum, total investment as size indicators and labour productivity, wage per employee, investment intensity as performance indicators. We are interested in the coefficient of the export status dummy β which can be interpreted as the export premium. Since the self selection process into exporting suggests that exporters are larger and better performing than non-exporters we expect β to have a positive sign.

In the analysis we distinguish 13 industries, so $k=13$, as we aggregate the 23 NACE 2-digit industries used in section 4 up to 13 NACE subsections. The reason for this is that we estimate equation (1) both at the level of manufacturing and at the level of individual industries which would be problematic for very small industries. We also drop two industries, the leather industry (NACE 19) and the refined petroleum industry (NACE 23) due to the small number of firms in these industries and uneasiness about merging them with other industries. Also, we left the medical, precision and optical instruments industry (NACE 33) separated and did not merge it with NACE industries 30, 31 and 32 to form NACE subsection DL as this industry includes a sufficient number of observations and is an important high-tech industry. The industries (or subsectors) are shown in Annex 2. The two eliminated industries are also excluded when we estimate the export premium at the manufacturing level. When estimating the export premia at the individual industry level, the regression equation is essentially the same but of course the industry dummies are absent.

$$\ln Y = \iota \cdot \alpha + ES \cdot \beta + YEAR \cdot \delta + \varepsilon$$

Further, in addition to the binary export status variable, we also use a similar regression specification that includes the export intensities, $EXTINT$, of firms introduced in the previous section. The export intensities are included as a set of dummy variables, where we use the group of non-exporters as the reference group. The expectation is that the coefficients on these export intensities are all positive and increasing, i.e. firms with higher export intensity also exhibit a larger size or performance premia. This specification takes the form

$$\ln Y = \iota \cdot \alpha + EXINT \cdot \beta + IND \cdot \gamma_{IND} + YEAR \cdot \delta + \varepsilon \quad (1')$$

Note that there are now four coefficients for the export premium to be estimated, one for each of the export intensity categories. These coefficients are summarized in the vector β which has dimension 4×1 . Again, we estimate this regression at the total manufacturing

level and at the level of the 13 individual industries. In the latter case the specification takes the form

$$\ln Y = \iota \cdot \alpha + EXINT \cdot \beta + YEAR \cdot \delta + \varepsilon$$

6.2 The export premia at the level of total manufacturing

The results for the export premia are provided in Table 5 for all size and performance measures. All results refer to the period 2002- 2006. The number of firm-year observations varies between 28,253 and 29,854 depending on the size or performance measure used as dependent variable. As expected we find the coefficient on the export premium being positive. The coefficients are also statistically significant at the 1% level for all size measures. Since we use a semi-log specification we have to transform our coefficient estimates in order to interpret them as a performance premium for exporters with respect to non-exporters in the estimated dependent variable¹¹. The results suggest that exporters are larger than non-exporters by a factor of 3.89 in terms of sales and by a factor of 4.17 in terms of investment. The size premium is considerably lower for employment (factor 2.30). In general, the export premium is much larger for the size measures than for labour productivity and the other performance measures (wages and investment intensity). For example, exporters are more productive than their purely domestic peers by a factor of 1.7, or, put differently exporters are 70% more productive than non-exporters.¹² The relative magnitudes of the performance premia are interesting in themselves. For example, the (labour) productivity premium by far exceeds the wage premium of exporters, which might indicate that exporters pass on smaller shares of their productivity advantage to their employees. The higher labour productivity could be the result of a more skilled workforce employed by exporter (a characteristic of which we have no information to control for) and therefore not entirely due to the export status. Indeed, if we assume investment-skill complementarities, the relatively high export premium found for investment intensity could suggest that the workforce of exporting firms is more skilled than those of non-exporters. Consequently, the wage premium would suffer from an upward bias due to omitted variables (i.e. the skill levels).

The results confirm the descriptive statistics of the firm sample discussed at length in Pöschl et al. (2009) as well as the estimated export premia which include all NACE divisions (15-37) in the manufacturing sector.¹³

¹¹ We do this by simply making the estimated coefficient of *EXP* (size premium of the exporting firm) the exponent of *e*. This retrieves a variable we can interpret in the usual way.

¹² Following the convention in the literature we refer to the export premium as the factor by which exporters' sales, productivity etc. exceed non-exporters' corresponding values instead of the advantage of exporters in terms of the percentage of non-exporters values.

¹³ In fact, the export premia reported here are slightly higher than those found in Pöschl et al. (2009), mainly because of the lower number of industry dummies included. These are, however, considerably lower than in the specification without industry dummies.

Table 5

Export premium for Austrian manufacturing firms, 2002-2006 (OLS) – manufacturing total

	(1) sales	(2) wage sum	(3) employment	(4) investment	(5) labour productivity	(6) wage	(7) investment intensity
ES1	1.358 *** (84.035) (0.000)	1.048 *** (74.545) (0.000)	0.833 *** (69.307) (0.000)	1.427 *** (60.316) (0.000)	0.533 *** (65.397) (0.000)	0.215 *** (53.883) (0.000)	0.585 *** (32.001) (0.000)
F	1046.28	982.491	698.263	508.031	766.836	1183.952	156.949
R ²	0.349	0.338	0.272	0.219	0.282	0.389	0.086
R ² -adj	0.348	0.338	0.271	0.218	0.282	0.388	0.085
Obs.	29854	29844	29841	28261	29828	29833	28253
implied export premium	3.888	2.852	2.300	4.166	1.704	1.240	1.795

All regressions use a full set of industry dummies and time fixed effects. Coefficients of the constant, industry dummies and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient. *** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

Table 6

Export premium by export intensity for Austrian manufacturing firms, 2002-2006 (OLS) – manufacturing total

	(1) sales	(2) wage sum	(3) employment	(4) investment	(5) labour productivity	(6) wage	(7) investment intensity
EXINT1	0.699 *** (29.808) (0.000)	0.534 *** (25.383) (0.000)	0.409 *** (22.944) (0.000)	0.739 *** (20.763) (0.000)	0.299 *** (24.704) (0.000)	0.125 *** (20.050) (0.000)	0.331 *** (11.401) (0.000)
EXINT2	1.069 *** (50.511) (0.000)	0.823 *** (44.182) (0.000)	0.636 *** (39.695) (0.000)	1.116 *** (36.360) (0.000)	0.432 *** (41.239) (0.000)	0.187 *** (35.795) (0.000)	0.47 *** (19.566) (0.000)
EXINT3	1.502 *** (49.040) (0.000)	1.128 *** (41.839) (0.000)	0.889 *** (37.676) (0.000)	1.567 *** (35.707) (0.000)	0.607 *** (40.666) (0.000)	0.239 *** (34.640) (0.000)	0.666 *** (20.239) (0.000)
EXINT4	2.107 *** (89.463) (0.000)	1.646 *** (79.236) (0.000)	1.343 *** (73.011) (0.000)	2.218 *** (67.433) (0.000)	0.786 *** (72.047) (0.000)	0.304 *** (58.893) (0.000)	0.866 *** (36.410) (0.000)
F	1061.91	968.507	687.013	518.584	743.526	1076.031	157.52
R ²	0.415	0.393	0.329	0.263	0.32	0.405	0.097
R ² -adj	0.415	0.392	0.329	0.262	0.319	0.404	0.097
Obs.	29854	29844	29841	28261	29828	29833	28253
implied export premium							
EXINT1	2.012	1.706	1.505	2.094	1.349	1.133	1.392
EXINT2	2.912	2.277	1.889	3.053	1.540	1.206	1.600
EXINT3	4.491	3.089	2.433	4.792	1.835	1.270	1.946
EXINT4	8.224	5.186	3.831	9.189	2.195	1.355	2.377

All regressions use a full set of industry dummies and time fixed effects. Coefficients of the constant, industry dummies and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient. *** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

The existence of the export premium is confirmed if we replace the simple export status variable by dummy variables categorizing the export intensities described above. The results for these regressions are summarized in Table 6. The resulting pattern is clear: the export premia of all size and performance measures increase with the export intensity. All coefficients remain statistically significant and there is no single deviation from the pattern of the export premium increasing with export intensity. For example, the results suggest that labour productivity of marginal exporters is 35% higher than that of non-exporters and that this labour productivity premium increases to 120% (implying a factor of 2.2) for firms with a very high export intensity.

6.3 The export premia at the level of individual industries

In a next step, we estimate the export premium separately for each of the industries described above. This is motivated by the fact that despite the industry dummies included in the pooled regression over all industries, the single estimated coefficient hides potential differences in the export premia across different industries. The OLS estimates in the overwhelming majority of cases remain statistically significant, most of them even at the 1% level. The sole exceptions are the employment premium and the premium for the wage sum in the chemical industry (NACE subsector DG) and the labour productivity premium in the transport industry (NACE subsector DM) (Table 7). However, as one can see there is a wide variation in the export premia across industries. In case of the size measures, the largest premia are found in the food, beverages and tobacco industry (NACE DA) and the electrical and the medical, precision and optical instruments industry (NACE 33), while the smallest premia are reported for the chemical industry (NACE DG) where the wage sum premium and the employment premium are not statistically significant and the rubber and plastics industry (DH). With respect to our performance measures, the food, beverages and tobacco industry (NACE DA) and the electrical and the medical, precision and optical instruments industry (NACE 33) are again those with the largest export premia while the smallest export premia are found in the mineral products industry (NACE DI).

Figure 4 presents some of the export premia graphically. It confirms that also at the level of individual industries, the employment premium, the lowest among the size measures, exceeds by far the productivity and the wage premium (except for food products, beverages and tobacco, DA).¹⁴ Moreover, the productivity premium is much higher than the wage premium of exporting firms, confirming the result at the level of total manufacturing.

¹⁴ The sole exception to this is the productivity premium in the food, beverages and tobacco industry (NACE DA) and the chemical industry (NACE DG) which is higher than the employment premium.

Table 7

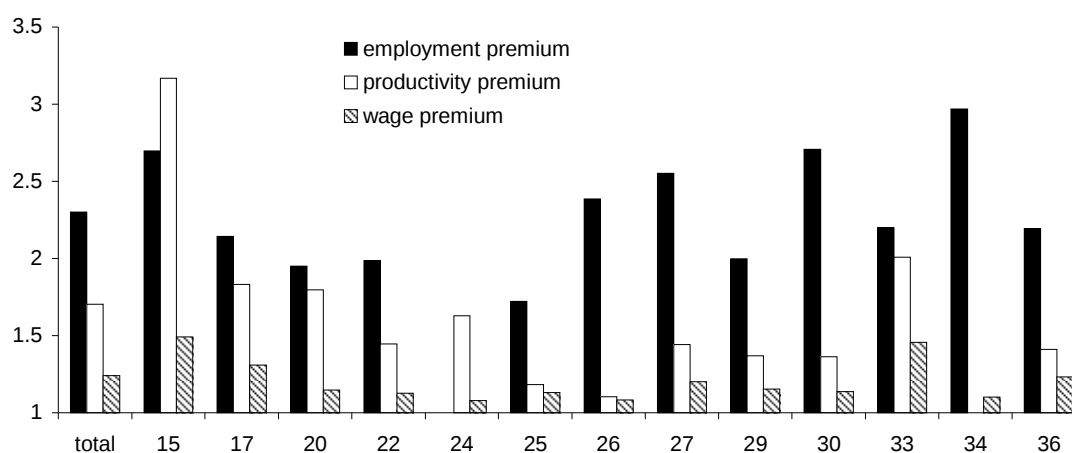
Export premium for Austrian manufacturing firms, 2002-2006
(OLS) – individual industries

	D	DA	DB	DD	DE	DG	DH	DI	DJ	DK	DL 30-32	DL 33	DM	DN
size premium														
sales	3.89	8.22	3.83	3.48	2.92	1.92	2.10	2.66	3.72	2.82	3.76	4.12	3.70	3.05
wage sum	2.85	4.03	2.80	2.23	2.25		1.95	2.62	3.08	2.28	3.08	3.20	3.27	2.68
employment	2.30	2.70	2.14	1.95	1.99		1.72	2.38	2.55	2.00	2.71	2.20	2.97	2.19
investment	4.17	8.68	3.30	3.75	3.03	2.03	2.30	3.06	4.16	2.66	5.09	6.06	5.13	2.83
productivity premium														
productivity	1.70	3.17	1.83	1.80	1.45	1.63	1.18	1.10	1.44	1.37	1.36	2.01		1.41
wage premium	1.24	1.49	1.31	1.15	1.13	1.08	1.13	1.08	1.20	1.15	1.14	1.46	1.10	1.23
investment intensity	1.79	3.23	1.57	1.91	1.52	1.74	1.40	1.26	1.59	1.32	1.85	2.77	1.77	1.28

All regressions use a full set of time fixed effects. The export premia shown are significant at least at the 5% level. Missing numbers indicate that the estimated coefficient is not statistically significant at the 10% level.

Figure 4

Export premium for Austrian manufacturing firms, 2002-2006
(OLS) – individual industries



All regressions use a full set of time fixed effects. The export premia shown are significant at least at the 5% level. Missing bars indicate that the estimated coefficient is not statistically significant at the 10% level.

As for total manufacturing, we also look at the export premium for firms with different export intensities at the industry level. Table 8 shows the estimation results for two of these measures, sales and labour productivity. The picture does not change dramatically: Most export premia are statistically significant even at the industry level and the export premia are again increasing with the share of export sales in total sales, i.e. with export intensity. There are, however, some interesting aspects emerging from Table 8. While in most industries even the marginal exporters are significantly larger (in terms of sales) and more productive there are exceptions to this. For example, in the rubber and plastics industry (DH) marginal exporters are not statistically different from non-exporters in terms of size

and labour productivity. With regards to labour productivity even firms with low-to-medium export intensity are not statistically more productive than non-exporters. A similar situation prevails in the machinery and equipment industry (DK). This result implies that in some industries there is a clear distinction in size and performance between exporting and non-exporting firms while in other industries the dividing line is not so much between exports and non-exporters but between firms with high export intensity and other firms.

Table 8

Export premium for Austrian manufacturing firms, 2002-2006, by export intensity (OLS) – individual industries

Sales premium	All	DA	DB	DD	DE	DG	DH	DI	DJ	DK	DL 30-32	DL 33	DM	DN
EXTINT1	0.699 *** 29.808 0.000	1.54 *** 24.310 0.000	0.15 1.086 0.278	0.507 *** 6.417 0.000	0.564 *** 9.604 0.000	-0.822 *** -2.831 0.005	-0.171 -1.475 0.140	0.505 *** 4.327 0.000	0.426 *** 9.845 0.000	0.139 1.462 0.144	0.17 1.180 0.238	0.703 *** 5.660 0.000	-0.309 -0.917 0.360	0.58 *** 12.627 0.000
EXTINT2	1.069 *** 50.511 0.000	2.236 *** 37.746 0.000	0.778 *** 6.720 0.000	0.971 *** 16.389 0.000	0.822 *** 12.830 0.000	0.153 0.695 0.487	0.183 * 1.830 0.068	0.851 *** 10.809 0.000	0.816 *** 18.475 0.000	0.388 *** 4.840 0.000	0.762 *** 6.078 0.000	0.425 *** 4.149 0.000	0.323 1.097 0.273	0.907 *** 17.790 0.000
EXTINT3	1.502 *** 49.040 0.000	2.744 *** 30.209 0.000	1.169 *** 9.863 0.000	1.263 *** 15.804 0.000	1.514 *** 12.040 0.000	0.594 ** 2.377 0.018	0.94 *** 6.973 0.000	1.523 *** 9.208 0.000	1.304 *** 19.466 0.000	0.727 *** 8.580 0.000	0.967 *** 5.283 0.000	1.029 *** 6.828 0.000	0.716 ** 2.166 0.031	1.281 *** 13.668 0.000
EXTINT4	2.107 *** 89.463 0.000	2.62 *** 24.382 0.000	1.786 *** 17.286 0.000	1.805 *** 26.049 0.000	2.465 *** 24.181 0.000	1.09 *** 5.236 0.000	1.19 *** 11.942 0.000	1.378 *** 11.063 0.000	2.335 *** 46.187 0.000	1.455 *** 19.777 0.000	1.811 *** 16.866 0.000	2.068 *** 24.140 0.000	1.933 *** 6.813 0.000	1.752 *** 22.286 0.000
F	1061.91	399.857	46.652	125.381	89.642	13.88	35.785	33.581	308.469	89.755	43.594	75.983	23.609	124.599
R ²	0.415	0.433	0.224	0.295	0.276	0.168	0.187	0.151	0.374	0.22	0.239	0.395	0.246	0.273
R ² -adj	0.415	0.432	0.219	0.293	0.273	0.156	0.181	0.147	0.373	0.217	0.233	0.39	0.234	0.272
Obs.	29854	5992	1187	2760	2516	578	1081	1684	5233	2574	957	1070	503	3719
implied export premium														
EXTINT1	2.01	4.66		1.66	1.76	0.44		1.66	1.53			2.02		1.79
EXTINT2	2.91	9.36	2.18	2.64	2.28		1.20	2.34	2.26	1.47	2.14	1.53		2.48
EXTINT3	4.49	15.55	3.22	3.54	4.54	1.81	2.56	4.59	3.68	2.07	2.63	2.80	2.05	3.60
EXTINT4	8.22	13.74	5.97	6.08	11.76	2.97	3.29	3.97	10.33	4.28	6.12	7.91	6.91	5.77

Table 8 continued

Table 8 (continued)

Labour productivity premium

	All	DA	DB	DD	DE	DG	DH	DI	DJ	DK	DL 30-32	DL 33	DM	DN
EXTINT1	0.299 *** 24.704 0.000	0.846 *** 23.925 0.000	0.194 ** 2.103 0.036	0.173 *** 4.609 0.000	0.237 *** 7.877 0.000	-0.145 -0.871 0.384	-0.05 -0.898 0.369	-0.012 -0.259 0.796	0.073 *** 3.420 0.001	-0.069 -1.634 0.102	-0.025 -0.402 0.688	0.284 *** 4.943 0.000	-0.275 -1.395 0.164	0.16 *** 7.724 0.000
EXTINT2	0.432 *** 41.239 0.000	1.206 *** 38.591 0.000	0.372 *** 5.714 0.000	0.391 *** 14.105 0.000	0.303 *** 10.498 0.000	0.071 0.763 0.446	-0.027 -0.588 0.557	0.144 *** 3.723 0.000	0.228 *** 11.920 0.000	0.107 *** 2.896 0.004	0.112 ** 1.970 0.049	0.326 *** 6.604 0.000	-0.051 -0.266 0.790	0.244 *** 10.924 0.000
EXTINT3	0.607 *** 40.666 0.000	1.521 *** 32.327 0.000	0.478 *** 7.479 0.000	0.674 *** 16.215 0.000	0.452 *** 10.859 0.000	0.377 *** 3.650 0.000	0.248 *** 4.102 0.000	0.215 *** 4.792 0.000	0.383 *** 11.515 0.000	0.245 *** 5.995 0.000	0.19 *** 2.655 0.008	0.667 *** 9.046 0.000	0.276 1.310 0.191	0.392 *** 10.068 0.000
EXTINT4	0.786 *** 72.047 0.000	1.454 *** 31.223 0.000	0.802 *** 14.991 0.000	0.895 *** 30.002 0.000	0.748 *** 16.784 0.000	0.789 *** 7.891 0.000	0.304 *** 6.850 0.000	0.069 1.530 0.126	0.671 *** 28.932 0.000	0.455 *** 14.052 0.000	0.467 *** 9.012 0.000	0.964 *** 27.733 0.000	0.354 * 1.907 0.057	0.609 *** 18.828 0.000
F	743.526	449.026	34.535	141.078	49.903	17.687	18.552	5.849	122.778	67.41	24.531	100.246	13.801	66.455
R ²	0.32	0.414	0.198	0.315	0.146	0.192	0.113	0.021	0.193	0.171	0.167	0.435	0.097	0.165
R ² -adj	0.319	0.413	0.193	0.313	0.143	0.18	0.106	0.016	0.192	0.168	0.16	0.431	0.082	0.163
Obs.	29828	5991	1185	2757	2515	578	1079	1681	5227	2572	957	1068	503	3715
implied export premium														
EXTINT1	1.35	2.33	1.21	1.19	1.27	0.87			1.08			1.33		1.17
EXTINT2	1.54	3.34	1.45	1.48	1.35	1.07		1.15	1.26	1.11	1.12	1.39		1.28
EXTINT3	1.83	4.58	1.61	1.96	1.57	1.46	1.28	1.24	1.47	1.28	1.21	1.95		1.48
EXTINT4	2.19	4.28	2.23	2.45	2.11	2.20	1.36	1.07	1.96	1.58	1.60	2.62	1.42	1.84

All regressions use a full set of time fixed effects. Coefficients of the constant and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient. *** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

6.4 The export premia – controlling for additional firm characteristics

We now return to the level of manufacturing and re-estimate the export premia but this time controlling for additional firm characteristics. The reason for this is that the estimation of the export premia according to (1) may suffer from omitted variable bias. The variation in firms' sale or labour productivity due to other factors such as investment in new technologies for example remains in the residuals. To the extent that investment in new technologies is also correlated with the export status variable, the latter suffers from an (upward) bias. In order to capture at least some of the potential bias in the estimates of the export premia we introduce employment to control for size and three technology-related variables. These are software investment per employee, R&D expenditure per employee, both in logs, and finally the share of R&D employees in total employees. These additional control variables are summarized in the X matrix in equation (2). The corresponding coefficients are denoted by ϕ .

$$\ln Y = \iota \cdot \alpha + ES \cdot \beta + IND \cdot \gamma_{IND} + YEAR \cdot \delta + X \cdot \phi + \varepsilon \quad (2)$$

Table 9

Export premium for Austrian manufacturing firms, 2002-2006, including control variables (OLS) – manufacturing total

without constant	sales	labour productivity	wages
software/employee	0.043 *** 6.566 0	0.043 *** 6.759 0	0.017 *** 6.162 0
R&D/employee	0.115 *** 12.219 0	0.116 *** 12.795 0	0.042 *** 8.729 0
share R&D personnel	-0.273 -1.291 0.197	-0.158 -0.76 0.447	0.078 0.737 0.461
employment	1.086 *** 117.212 0	0.085 *** 9.436 0	0.068 *** 17.249 0
ES1	0.157 *** 3.866 0	0.161 *** 3.98 0	0.074 *** 4.438 0
F-tets	1058.245	52.704	83.665
R ²	0.874	0.24	0.309
R ² -adj	0.874	0.236	0.305
Obs.	3667	3667	3666
implied export premium	1.170	1.175	1.077

All regressions use a full set of industry dummies and time fixed effects. Coefficients of the constant, industry dummies and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient. *** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

Table 9 shows the estimation result for sales, labour productivity and wages. A major result is that the export premium remains statistically significant. The results, however, show that the export premia are considerably smaller than in the specification without control variables. For example, the implied size premium of exporters in terms of sales is now of a factor 1.17 implying that exporters are 17% larger than non-exporters. The result on the sales premium – a size measure - is interesting because the explanatory variable includes another size measure, employment, and the export premium is still statistically significant.

With respect to the control variables, these all turn out to be highly significant with the exception of the share of R&D personnel. Turning to the performance measures – labour productivity and wages – we find that these are also much lower than in the specification without control variables. Exporters are 17.5% more productive than non-exporters and they pay about 8% higher wages.¹⁵ The considerable reduction of the magnitudes of the export premia indicates that the additional control variables capture a good deal of the omitted variable bias. We therefore prefer these results over the more parsimonious OLS-specifications that only include year and industry dummies as control variables. Also, the size of the estimated export premia appears to be more plausible.

6.5 Changing the estimation technique: a random effects model

The panel structure of our data set allows us to apply panel estimation techniques. So far we have made use of the panel structure only by adding time fixed effects which have been included in all the estimations. We refer to these as ‘pooled model’ because of the absence of firm effects. Now we use a random effects estimator which implies that we assume a firm-specific error-component. The estimation results are shown in Table 10.

In the firm random effects model the export premium for all our size and performance measures is statistically significant. The coefficients are comparable in magnitude with the results from the OLS-estimates including additional control variables. For example, the implied sales premium of exporters is 1.175 which is very close to the factor 1.170 reported in Table 9 above. Similarly, the random effects model finds exporters to be 18.5% more productive than non-exporters compared to 17.5% in the pooled model with control variables. The estimates are also comparable for the wage measure where the random effects model suggests a wage premium of factor 1.087, i.e. exporters pay 8.7% higher wages than non-exporters.

¹⁵ In contrast to other country studies we estimate the export premium for different dependent variables with the same set of control variables instead of changing it for each of the independent variables (e.g. Greenaway and Kneller, 2004). This means that only a subset of our seven size and performance measures make sense while employment, the two investment measures and the wage sum are either impossible to estimate or too closely related to the explanatory variables included.

Table 10

**Export premium for Austrian manufacturing firms, 2002-2006,
including firm random effects (RE) – manufacturing total**

Random Effects specification

	sales	wage sum	employment	investment	labour productivity	wages	investment intensity
ES1	0.161 *** 17.914 0.000	0.118 *** 15.516 0.000	0.090 *** 14.534 0.000	0.774 *** 26.771 0.000	0.170 *** 18.502 0.000	0.083 *** 19.250 0.000	0.417 *** 18.013 0.000
sigma_u	1.192	1.046	0.909	1.4	1.182	0.270	0.884
sigma_e	0.236	0.2	0.162	1.019	0.241	0.139	1.014
R ² -overall	0.228	0.238	0.177	0.203	0.237	0.365	0.083
R ² -between	0.219	0.226	0.166	0.24	0.232	0.382	0.121
R ² -within	0.037	0.049	0.001	0	0.033	0.091	0.001
Obs.	29854	29844	29841	28261	29836	29833	28253
Nb of groups	8061	8053	8052	7848	8051	8046	7842
implied export premium	1.175	1.125	1.094	2.168	1.185	1.087	1.517

All regressions use a full set of firm random effects and time fixed effects. Coefficients of the constant, firm and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient. *** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

While the results are very reassuring, a simple Hausman test suggests that a fixed effects model is to be preferred over a random effects model because of the latter lacking consistency.

6.6 Changing the hypothesis: a fixed effects model

Given the result of the Hausman test we could try to re-estimate again the export premia, this time including firm fixed effects. Because of the time fixed effects already incorporated we end up having a two-way fixed effects model which takes the form:

$$\ln Y = \alpha \cdot t + ES \cdot \beta + Z_{\mu} \cdot \mu + YEAR \cdot \delta + v \quad (3)$$

where Z_{μ} is a large $NT \times N$ matrix with firm fixed effects and μ is the corresponding vector of coefficients with dimension N , the number of firms. The $NT \times 1$ vector v contains the error terms. All other variables are as before. In particular β remains the main variable of interest, although – as will be seen – its interpretation changes.

This strategy however implies that we do not only change the estimator but also the hypothesis to be tested. With the fixed effects estimator only variations within firms are exploited so that our parameter of interest, β , only captures the difference in the dependent variable due to within firm changes in the export status over time. Thus, the way to interpret the estimated coefficient of the export status dummy variable is now different. It does no

longer indicate by how much exporters are larger or better performing than non-exporters; instead, it indicates by how much, on average, firms that switch from being a non-exporter to being an exporter (or vice versa) are larger or better performing in periods when they are exporters.¹⁶

The results for the fixed effects regression are summarized in Table 11.

Table 11

**Estimation results with firm fixed effects, simple export status
(total manufacturing, 2002-2006)**

	sales	wage sum	employ- ment	invest- ment	labour produc- tivity	wage per employee	invest- ment intensity
ES1	0.044 ***	0.032 ***	0.029 ***	-0.001	0.017 **	0.003	-0.032
	4.892	4.197	4.676	-0.032	2.176	0.557	-0.807
	0.000	0.000	0.000	0.974	0.030	0.578	0.420
F-test	240.587	294.695	21.026	10.251	219.313	490.170	10.204
R ² -overall	0.049	0.031	0.133	0.000	0.027	0.017	0.002
R ² -between	0.041	0.020	0.124	0.008	0.036	0.004	0.032
R ² -within	0.052	0.063	0.005	0.003	0.048	0.101	0.002
Test for poolability	114.215	124.491	135.426	9.151	32.300	20.334	4.079
Obs.	29854	29844	29841	28261	29828	29833	28253
Nb of groups	8061	8053	8052	7848	8045	8046	7842
implied export premium	1.0450	1.0325	1.0294		1.0171		

All regressions use a full set of firm and time fixed effects. Coefficients of the constant, firm and year fixed effects are not shown; t-values and p-values are shown below the respective coefficient.*** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. The implied export premium is retrieved by making the coefficient of the export premium the exponent of e.

Table 11 shows that in the fixed effects model the export status coefficient is statistically significant in only four out of our seven measures. These are mainly the size measures (sales, wage sum and employment) but also labour productivity. In contrast, the coefficient of the export status dummy is not statistically significant for the investment measures and wages.

Moreover, the magnitude of the estimated coefficients becomes rather small. The implied premium in terms of sales for example, is now only of a factor 1.045. But this is not to be interpreted as a premium that exporters enjoy over non-exporters. It rather indicates that, on average, switchers have 4.5% higher sales in periods where they are exporting than in periods where they are not exporting.¹⁷ For the productivity measure, this premium is only

¹⁶ This interpretation of the coefficient of the export dummy variable differs from that offered in the cross-country study by ISGEP (2008). There the estimated coefficients of the export dummy variable is interpreted as the export premium, similar to a pooled specification without firm fixed effects.

¹⁷ When controlling for firm-fixed effects, the export status variable does not add any information for those firms that are either always exporting or never exporting. In these cases the export status is included in the fixed effect because it

1.7%. While these coefficients appear to be miniscule in comparison to the results from the previous specifications one has to bear in mind the difference in interpretation. The result that switching firms are significantly larger and more productive in periods of exporting even if only to a limited extent, in our view, gives additional support to the existence of an export premium.

It is all the more remarkable as the number of switching firms that drive this result is not too large. Only 6.3% of the firms-year observations where firms initially did not export are switches to exporting while among exporters 4.2% of the observations are switches to non-exporting (Table 12). In total just 5.1% of the firms are export switchers.

Table 12

Exporting, non-exporting and switching firms (transition matrix)

		non-exporters	switchers (to exporting)	obs total
no. of obs in % of total		8,963	601	9,564
		93.72	6.28	100
		switchers (to non-exporting)	exporters	obs total
no. of obs in % of total		514	11,710	12,224
		4.2	95.8	100
obs total	no. of obs in % of total	9,477 43.5	12,311 56.5	21,788 100
switchers total	no. of obs in % of total	1,115 5.1		

7 The probability of exporting

Given the regression results so far it is safe to conclude that exporting coincides with larger size and better performance of firms. This correlation does not imply a causality running from exporting to firm size or performance just because we chose the latter to be the dependent variables and the export status to be the explanatory variable in our regression model. One way to approach the issue of causality is to switch from a linear regression model to a probit model and use the export status as the dependent variable. In order to study whether firm characteristics increase the probability of a firm being an exporter we take the (one period) lagged values of the explanatory variables which include firm characteristics such as employment and productivity. The probit model allows us to include a series of explanatory variables and evaluate their impact on the probability that a firm exports.

does not change over time. Note, however, that other studies which also report a fixed effect model in the context of export status estimation give the 'classical' export premium interpretation to the results (see ISGEP, 2008).

It takes the form:

$$\Pr(ES = 1|X) = \Phi(X \cdot \omega) \quad (4)$$

where $\Phi(\cdot)$ is the standard normal cumulative distribution function and the matrix X contains all explanatory variables and ω is the corresponding vector of coefficients. In addition to the variables reported in Table 13 the matrix X also includes industry dummies and regional dummies for the nine Austrian regions (*Bundesländer*). In order to investigate the question whether firms self-select themselves into exporting, meaning they export *because* they are larger and more productive we include the explanatory variables in lagged form.

Table 13

Results from probit estimation – total manufacturing, 2002-2006

Marginal effects from probit estimation

Explanatory variable	(1)	(2)	(3)	(4)	(5)	(6)	(7)
labour productivity _{t-1}	0.359 *** 53.451 0.000		0.268 *** 38.252 0.000	0.166 *** 16.882 0.000		0.131 *** 12.944 0.000	
employment _{t-1}		0.244 *** 52.856 0.000	0.192 *** 39.061 0.000		0.113 *** 16.417 0.000	0.091 *** 12.624 0.000	
ES _{t-1}				0.860 *** 96.716 0.000	0.857 *** 96.322 0.000	0.847 *** 92.218 0.000	0.847 *** 92.312 0.000
labour productivity _t							0.135 *** 13.487 0.000
employment _t							0.091 *** 12.585 0.000
pseudo-R ²	0.279	0.283	0.338	0.73	0.73	0.736	0.737
Obs.	21625	21629	21625	21625	21629	21625	21624
observed P	0.566	0.566	0.566	0.566	0.566	0.566	0.566
predicted P	0.592	0.611	0.610	0.627	0.638	0.637	0.637

Results from probit regression. All regressions use a full set of industry dummies and region dummies for the Austrian provinces. Coefficients of the constant, year fixed effects, industry and region dummies are not shown; t-values and p-values are shown below the respective coefficient.*** indicates significance at the 1% level, ** indicates significance at the 5% level, * indicates significance at the 10% level. Marginal effects evaluated at the mean of independent variables, except for the (lagged) export status where the marginal effect is the change in probability from a discrete change in this binary variable.

We report the marginal effects, evaluated at the mean of the explanatory variables in Table 13. The result suggests that both labour productivity (performance measure) and employment (size measure) significantly increase the probability of exporting. Also the individual effect of these firm characteristics is smaller when they enter the probit model simultaneously. In this case an infinitesimal increase in productivity and employment induce a change in export probability of 27% and 19% respectively (specification 3). The most striking result from the probit estimation, however, is the significant and very large

impact of the previous export status. Being an exporter in the previous period increases the probability of exporting by 85% in our preferred model which also includes labour productivity and employment (specification 6 in Table 13). The impact is very robust across all specifications. This is evidence for a strong persistence effect of exporting. These findings are in line with the result of Greenaway and Kneller (2004) for the United Kingdom and the relatively low number of export switchers in our firm sample.

The inclusion of the lagged export status also further reduces the marginal effects of productivity and employment but their coefficients remain statistically significant. A marginal increase in productivity leads to an increase in the probability to export of 13%. The fact that past capabilities of firms increase the probability of exporting may be read as evidence for self-selection of firms into exporting, that is, larger and better performing firms also export. However, the overriding persistence of exporting reduces the possibility of deriving from the impact of 'past talent' on the probability to export a causality running from productivity to exporting. We show this by replacing the lagged variables for labour productivity and employment with their current values together with the lagged export status (specification 7). The result is almost identical with the specification including the variables in lagged form (specification 6) and weakens the case for a causal interpretation to the probit results despite the use of lagged dependent variables.

8 Conclusions

Drawing the main conclusions from our analysis of the characteristics of Austrian exporting and non-exporting firms in the manufacturing sector, Austrian exporting firms are larger in terms of various size measures employed and are performing better in terms of productivity, wages and investment intensity compared to non-exporting firms. These results are in line with those for other countries. While the result of the paper is hardly world-shattering it nevertheless fills a gap in the literature as for Austria, a detailed study on this issue has so far not existed. Employing a simple definition of the export status we estimate the export premium for four size measures (sales, the wage sum, employment, investment) and three performance measures (labour productivity, wages per employee, investment intensity). The results from the (descriptive) panel regression, which includes only time and industry dummies as control variables, suggest statistically significant and economically large export premia. We also regress the export premia at the level of industries and, in line with the descriptive statistics, find significant export premia although their size varies considerably over individual industries. We also show that export premia are increasing along with export intensity, both at the manufacturing level and the industry level. Adding additional (R&D-related) control variables significantly reduces the magnitude of the export premia to about 17% for sales and labour productivity and to 8% for wages. The statistical significance of the coefficients, however, remains perfectly intact. These results seem to us much more plausible than the more parsimonious model that includes

only industry and time dummies as controls which are severely (upward) biased. We are confident, however, that the results from our richer model with additional controls remedy a lot of the omitted variable bias and would conclude that the existence of statistically significant and economically important export premia is a very robust result.

We further check the robustness of the export premia by using different panel estimation techniques. This check is successful in the case of the random effects model. A robustness check of the export premia result with a fixed effects model, however, is not possible as this model in fact tests another hypothesis, i.e. to what extent export switchers differ on average in periods when they export from periods when they do not export. The results from the fixed effects model are nevertheless interesting because they show that export switchers are 4.5% and 2.9% larger in terms of sales and employment respectively and are 1.7% more productive in periods where they export. This can be read as additional evidence that even first-time exporters may significantly differ from non-exporters. Apart from the result on switchers provided by the fixed effects estimation it is important, in our view, to point to the differences in hypothesis that a fixed effects model tests when applied to estimating the Bernard-Jensen type export premium.

Finally, we find a huge persistence of exporting among the firms of our sample. In fact, having reached exporter status in the previous year increases the probability of exporting by 85% this year. There is also evidence for a positive impact of firms' past performance on the probability of exporting, which lends support to the self-selection into export markets hypothesis proposed in the Melitz model. However, the large persistence of exporting weakens the case for arguing that the causality is running from firms' performance to exporting and not vice versa.

There is ample room for extending the estimation of the export premium in Austrian manufacturing. One obvious extension is to add total factor productivity as a performance measure. Moreover, the issue of causality could be further explored by tracking the development of productivity of export switchers before and after their entry into export. Finally, we could extend the observation period back until 1997 in order to gain variation over time within firms which might improve the results of our fixed effects estimations.

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9 Appendix

Table A.1

NACE classification – divisions

NACE Description

15	Manufacture of food products and beverages
16	Manufacture of tobacco products
17	Manufacture of textiles
18	Manufacture of wearing apparel; dressing and dyeing of fur
19	Tanning and dressing of leather; manufacture of luggage, handbags, saddlery, harness and footwear
20	Manufacture of wood and of products of wood and cork, except furniture; manufacture of articles of straw and plaiting materials
21	Manufacture of pulp, paper and paper products
22	Publishing, printing and reproduction of recorded media
23	Manufacture of coke, refined petroleum products and nuclear fuel
24	Manufacture of chemicals and chemical products
25	Manufacture of rubber and plastic products
26	Manufacture of other non-metallic mineral products
27	Manufacture of basic metals
28	Manufacture of fabricated metal products, except machinery and equipment
29	Manufacture of machinery and equipment n.e.c.
30	Manufacture of office machinery and computers
31	Manufacture of electrical machinery and apparatus n.e.c.
32	Manufacture of radio, television and communication equipment and apparatus
33	Manufacture of medical, precision and optical instruments, watches and clocks
34	Manufacture of motor vehicles, trailers and semi-trailers
35	Manufacture of other transport equipment
36	Manufacture of furniture; manufacturing n.e.c.
37	Recycling

Table A.2

NACE classification – subsections and divisions used in econometric part

NACE	Description
DA	Manufacture of food products, beverages and tobacco
DB	Manufacture of textiles and textile products
DD	Manufacture of wood and wood products
DE	Manufacture of pulp, paper and paper products; publishing and printing
DG	Manufacture of chemicals, chemical products and man-made fibres
DH	Manufacture of rubber and plastic products
DI	Manufacture of other non-metallic mineral products
DJ	Manufacture of basic metals and fabricated metal products
DK	Manufacture of machinery and equipment n.e.c.
DL 30-32	Manufacture of electrical equipment
DL 33	Manufacture of medical, precision and optical instruments, watches and clocks
DM	Manufacture of transport equipment
DN	Manufacture of furniture; manufacturing n.e.c. and Recycling

Note: Sub-sections DC (leather) and DF (refined petroleum) have been excluded.