# Scopus



# Documents

Etro, F., Stepanova, E. Entry of painters in the Amsterdam market of the Golden Age (2016) *Journal of Evolutionary Economics*, 26 (2), pp. 317-348.

DOI: 10.1007/s00191-016-0456-6

<sup>a</sup> Department of Economics, University of Venice Ca' Foscari, Sestiere Cannaregio, 30121, Fond.ta S.Giobbe 873, Venice, Italy

<sup>b</sup> Laboratory of Economics and Management, Sant'Anna School of Advanced Studies, 56127, Piazza Martiri della Liberta'
 33, Pisa, Italy

# Abstract

We analyze the evolution of the entry of painters and price of paintings in the XVII century Amsterdam art market. In line with evolutionary theory, demand-driven entry in the market was first associated with product innovations and a rapid increase in the number of painters. After reaching a peak, the number of painters started to decrease in parallel with a price decline and the introduction of process innovations. To test for the role of profitability in the art market as a determinant of endogenous entry of painters, we build a price index for the representative painting inventoried in Dutch houses. This is based on hedonic regressions controlling for characteristics of the painters. After a peak at the beginning of the century, the real price of paintings decreased until the end of the century. We provide anecdotal evidence for which high initial prices attracted entry of innovators, and econometric evidence on the causal relation between price movements and entry. © 2016, Springer-Verlag Berlin Heidelberg.

# **Author Keywords**

Art market; Dutch golden age; Endogenous entry; Hedonic prices; VAR analysis

# **Correspondence Address**

Etro F.; Department of Economics, University of Venice Ca' Foscari, Sestiere Cannaregio, 30121, Fond.ta S.Giobbe 873, Italy; email: federicoetro@yahoo.it

Publisher: Springer New York LLC

ISSN: 09369937 Language of Original Document: English Abbreviated Source Title: J. Evol. Econ. Document Type: Article Source: Scopus

# ELSEVIER

Copyright © 2016 Elsevier B.V. All rights reserved. Scopus® is a registered trademark of Elsevier B.V.

REGULAR ARTICLE



# Entry of painters in the Amsterdam market of the Golden Age

Federico Etro<sup>1</sup> · Elena Stepanova<sup>2</sup>

Published online: 2 April 2016 © Springer-Verlag Berlin Heidelberg 2016

**Abstract** We analyze the evolution of the entry of painters and price of paintings in the XVII century Amsterdam art market. In line with evolutionary theory, demanddriven entry in the market was first associated with product innovations and a rapid increase in the number of painters. After reaching a peak, the number of painters started to decrease in parallel with a price decline and the introduction of process innovations. To test for the role of profitability in the art market as a determinant of endogenous entry of painters, we build a price index for the representative painting inventoried in Dutch houses. This is based on hedonic regressions controlling for characteristics of the paintings (size, genre, placement in the house), the owners (job, religion, value of the collection, size of the house) and the painters. After a peak at the beginning of the century, the real price of paintings decreased until the end of the century. We provide anecdotal evidence for which high initial prices attracted entry of innovators, and econometric evidence on the causal relation between price movements and entry.

Keywords Art market  $\cdot$  Endogenous entry  $\cdot$  Dutch golden age  $\cdot$  Hedonic prices  $\cdot$  VAR analysis

Federico Etro federicoetro@yahoo.it

> Elena Stepanova e.stepanova@sssup.it

- <sup>1</sup> Department of Economics, University of Venice Ca' Foscari, Sestiere Cannaregio, 30121, Fond.ta S.Giobbe 873, Venice, Italy
- <sup>2</sup> Laboratory of Economics and Management, Sant'Anna School of Advanced Studies, 56127, Piazza Martiri della Liberta' 33, Pisa, Italy

# JEL Classification $Z11 \cdot N0 \cdot D4$

"Art likes to be near wealth so as to be maintained with rich rewards," Karel van Mander, Lives of the Illustrious Netherlandish and German Painters (1604)

One of the most innovative and dynamic fields of human production is art. Through the course of art history a sequence of artistic innovations has shaped the market for paintings in a continuous process of creative destruction. To mention some of the technical innovations in painting, think of the introduction of oil color to replace *tempera*, the technique of linear perspective and the use of "*sfumato*" to enhance realism, the specialization in new genres such as landscapes and still life paintings, the use of the *camera obscura*, and so on;<sup>1</sup> of course, each new artistic style represents an innovation that grants fame and market power. From an economic point of view, we would expect that the rate of profitability in the market for painters should be an important determinant of entry in that market and also of innovative contributions: not by chance, most of the innovations in the history of painting took place in highly dynamic and rich communities such as Medieval Flemish towns during the XV century, Renaissance Italian towns such as Florence and Venice during the XV and XVI century and Dutch towns during the XVII century. In this work, we analyze historical data on entry and pricing in the market for paintings in Amsterdam during its Golden Age and we argue that the evolution of the return of the painting activity did cause to a large extent the entry of new and innovative painters.

The process of entry and competition in the art market can be interpreted in terms of creative destruction. Indeed, the art market could be seen as a Schumpeter Mark I sector: as is well known, such a sector is characterized by turbulent environments with low entry barriers where innovations are mainly associated with the entry of new producers replacing the incumbents through a process of "creative destruction". Artistic creativity is often associated with innovations replacing the routines of an established style.<sup>2</sup> The evolution of entry in innovative markets and the key role of profitability in attracting entry has been widely discussed in evolutionary theories (Gort and Klepper 1982; Winter 1984; Klepper 1996).

Moreover, and separately from these Schumpeterian aspects, entry and competition in the art market can be interpreted as elements of a general industry life cycle: Klepper (1996) has characterized the typical life cycle of mass markets characterized by endogenous entry and innovation. His model is based on an entry process that is demand driven and reproduces basic stylized facts.<sup>3</sup> First, the initial development of a market is characterized by the introduction of new products and an increase in the number of entrants (Gort and Klepper 1982): in our market, new genres (landscapes, still lifes,..) were initially introduced and the number of painters increased rapidly, from about 50 at the end of the XVI century to more than 150 in the third decade

<sup>&</sup>lt;sup>1</sup>See Kemp (1990) on the history of technical innovations in art history.

<sup>&</sup>lt;sup>2</sup>On related aspects of evolutionary economics, see Nelson and Winter (1982, Ch. 13) and Winter (1984).
<sup>3</sup>For a survey and analysis of entry patterns in other markets, see Klepper (1997, 2002) and Klepper and Graddy (1990).

of the XVII century.<sup>4</sup> Second, after growth at declining rates, the number of producers should reach a peak and then decline steadily in spite of the continued growth in output (Klepper 1996, p. 564): this phenomenon emerged quite clearly in our market with a peak in the number of painters at the middle of the XVII century (more than 250 painters active in town), while artistic creativity was still flourishing, and a subsequent decline (to about 180 painters active at the end of the century). Third, the number of product innovations tends to reach its peak when the number of producers is still increasing, and the most recent entrants account for a disproportionate share of product innovations (Klepper 1996, p. 565): this is consistent with the impressive period of artistic innovations developed by new talents such as Honthorst, Rembrandt, Hals and others during the first half of the XVII century. Fourth, producers start devoting an increasing effort to process innovations rather than product innovations: this is exactly what happened in the Dutch art market with the introduction of cost savings techniques such as genre specialization, imitation and replication of paintings to create scale economies. Our analysis will confirm these basic elements, adding evidence for a positive correlation between profitability in the art market and entry. However, the main insight is that the elements of a typical industry life cycle appear in a pre-modern market where economics is usually thought to be less relevant than creativity.<sup>5</sup>

To study the relation between profitability and entry, we need to examine art pricing over time. For this purpose, we have built on the pioneering work of John Montias: his early investigations on art prices from historical archives have been focused on inventories mainly from Delft (Montias 1982), Amsterdam and Dordrecht (Montias 1996; Loughman and Montias 2001) and on auctions from Amsterdam (Montias 2002).<sup>6</sup> These studies have pointed out a number of interesting stylized facts and provided descriptive statistics on the paintings found in houses and traded at auctions.<sup>7</sup> Here we add an econometric dimension aimed at verifying the determinants of art prices, their pattern over time and their role in attracting innovative painters.<sup>8</sup>

We examine works by Dutch and Flemish painters contained in inventories from Amsterdam.<sup>9</sup> The dataset puts together information collected at the Frick Collection

<sup>&</sup>lt;sup>4</sup>Data on the number of painters in each Dutch city have been recently put together by the Ecartico project of the Amsterdam Centre for the Study of the Golden Age based at the University of Amsterdam.

<sup>&</sup>lt;sup>5</sup>For a challenging essay on the role of interests and ideas in changing pre-modern northwestern Europe, see McCloskey (2015).

<sup>&</sup>lt;sup>6</sup>Recent interdisciplinary research in economic history and cultural economics has been focused on the organization of historical markets for paintings, mainly during the XVII century for both primary markets (for instance see North 1999; Spear and Sohm 2010; Etro and Pagani 2012, 2013) and secondary markets (Montias 1991, 2002). For a parallel investigation on the economics of music composers in the XVIII and XIX centuries see Scherer (2004).

<sup>&</sup>lt;sup>7</sup>For surveys, see De Marchi and Van Miegroet (1994, 2006).

<sup>&</sup>lt;sup>8</sup>Hedonic price indexes for paintings were introduced by Chanel et al. (1994).

<sup>&</sup>lt;sup>9</sup>Inventories contain price evaluations rather than prices of effective transactions. However, as shown in Etro and Stepanova (2013), the analysis of prices from auctions leads to very similar results, suggesting that evaluations in inventories did reflect prices from the secondary market. We focus on inventories because the available data cover the entire century while auctions data are available only with gaps for the first four decades and the last two of the century.

Research Center and the Getty Research Institute. In contrast to the past descriptive analysis of these data (Montias 2002), we convert the nominal prices of paintings into real ones: we adjust nominal prices with yearly inflation derived from the van Zanden consumer price index built on the basis of multiple price series (see De Vries and van der Woude 1997). Therefore, our econometric investigation determines the relation between the relative price of paintings and the characteristics of the paintings, the painters (their fixed effects), the collection (purpose of the inventory, average price of its paintings, room of the house in which the painting was placed) and the owners (jobs, religion, number of rooms in their houses). Controlling simultaneously for all the mentioned objective features and the indirect proxies for quality, we run hedonic regressions and obtain a price index that shows the evolution of the price of a representative painting during the Dutch Golden Age. As far as we know, this is the oldest hedonic price index constructed from historical prices of paintings.<sup>10</sup>

After controlling for inflation and paintings' characteristics, we find that the real price of paintings reached a peak at the beginning of the century and then declined slowly during the rest of the century.<sup>11</sup> We argue that this evolution of the profitability of painting may have driven the entry process in line with the Klepper (1996) model and other dynamic models of endogenous entry as Etro and Colciago (2010): first, market growth and high profitability attracted the entry of painters in the market, fostering product differentiation and innovation, then entry slowed despite continued market growth and, finally, exit overtook entry while innovations were mainly aimed at improving the production process. There is some anecdotal evidence for such an evolutionary pattern in economic history and art historical studies (for instance, Prak 2008). The economic boom and the increasing demand by the Dutch middle class between the end of the XVI century and the beginning of the XVII century led to high prices, which induced a process of entry of new and innovative painters attracted by the high profitability of the profession. Our price index and data on the evolution of the number of painters in Amsterdam confirm this. Since innovation is a process of search and selection of new techniques replacing established routines (here artistic styles), the expansion in the number of painters at the beginning of the century increased the scope for artistic innovations and contributed to determine what is now known as the Dutch Golden Age, with masters such as Rembrandt, Ruisdael, Dou,

<sup>&</sup>lt;sup>10</sup>The price regressions provide some interesting results in their own, showing, for instance, that smaller paintings, copies, anonymous paintings and paintings placed in private rooms or in the kitchen tend to have lower prices. The number of rooms in the house of the owner is a proxy for wealth and tends to be positively related to prices. Contrary to what emerges from descriptive statistics (Montias 1982, 2002), price differentials for alternative genres (figuratives, landscapes, genre paintings, still life paintings) disappear after controlling for the unobservable quality of paintings with the artists' fixed effects. Finally, inventories drawn after the death of the owner or for a marriage have higher prices on average than those due to the insolvency of the owner or drawn to build a collateral for debt.

<sup>&</sup>lt;sup>11</sup>Early investigations were only based on nominal prices (Chong 1987; North 1999) and have pointed out an increase in average nominal prices from the beginning to the end of the century, with only price reductions for landscape paintings (Montias 1996) and genre paintings from the first to the second quarter of the century.

Vermeer, Steen, Metsu and many others. This also led to more intense competition, specialization in different genres, clustering of painters (by genres in different towns) to create agglomeration economies, imitation and the adoption of the tonal style to create scale economies and reduce costs. All this contributed to the gradual reduction in prices during the last part of the century.

While long run patterns for prices and entry of painters emerge clearly, short run causation is less obvious. We provide new econometric evidence for a direct link between profitability and entry by analyzing the time series of our price index and entry of painters in Amsterdam. The analysis suggests that causality works in the expected way also in the short run, at least in the sense of Granger-causality. Indeed, we find increasing prices attracting entry of painters on one side and more painters inducing declining prices on the other side. Moreover, a VAR analysis confirms that an increase in the average price of paintings leads to the entry of new painters only after some years, possibly the time needed to enter the market (the average length of apprenticeship was six years), with some weaker evidence that entry had an immediate negative effect on prices. These results appear in line with our thesis of endogenous entry applied to the art market: the same evolution of art history could have been endogenously affected by the evolution of profitability in the painting sector.<sup>12</sup>

The paper is organized as follows. In Section 1, we review related studies on Dutch inventories and sketch our main results. In Section 2, we describe the dataset and analyze the effects of demand and supply conditions on innovations. In Section 3, we discuss our hedonic regression analysis and derive the price index. Section 4 analyzes the time series of the price index and the entry of painters to test our main hypothesis. Section 5 concludes.

# 1 The Dutch golden age and the market for paintings

The Low Countries became the dominant economic power in Europe during the early XVII century, with innovative leadership in shipbuilding, the textile industry, selected manufacturing sectors and trade. The Dutch middle class was richer than in any other place at the time, and the real wage of the working class kept increasing between the end of the XVI century and the middle of the XVII century (De Vries 1982; De Vries and van der Woude 1997).<sup>13</sup> As a consequence, the increasing demand of art by the Dutch middle class attracted new painters in all the main Dutch towns and in particular Amsterdam, which was one of the largest cities in Europe at the time. Some of them were immigrants from Flanders, where a solid artistic tradition was already established (see Martens and Peeters 2006), but most of them were locals who decided to become artists.

<sup>&</sup>lt;sup>12</sup>Similar theses have been advanced to link the high prices of paintings to other innovative periods, such as Mannerism and Rococo in Venice (Etro and Pagani 2013), the Neoclassical age in Paris (Etro and Stepanova 2015) and the Victorian age in London (Bayer and Page 2011; Etro and Stepanova 2017). However, as far as we know, this is the first attempt to provide causal evidence in support of this thesis.

 $<sup>^{13}</sup>$ On the Dutch society of the time see Schama (1987).

The occupational choice to become a painter required an apprenticeship usually of six years, which was rather costly in terms of fees and forgone earnings,<sup>14</sup> and, of course, was uncertain in its outcome. After such an investment in human capital, the local Guild of St. Luke gave the right to sign and sell paintings in town. The objective of the guild was to protect the earnings of the affiliates, regulate the apprenticeship, and try to restrict the activity of foreign artists and the frequency of public sales (auctions and lotteries), but in a large town such as Amsterdam, competition was strong and it was even hard for the guild to control the membership of all the painters active in town (see Prak 2008).<sup>15</sup> It is well known that, at the beginning of the century, the artistic profession could be quite remunerative for a successful painter: Montias (1982) has estimated that Dutch artists at the beginning of the Golden Age had an average net income between 1,150 and 1,400 guilders a year, three times as much as a master carpenter, and more than other skilled craftsmen. From the end of the XVI century, Dutch and Flemish painters started to introduce new genres (still life, portrait, landscape, genre painting or figurative painting); this is typically the initial phase in the development of a market (Gort and Klepper 1982). Moreover, for the first time in art history, painters started working for an anonymous market rather than for commissions, with the exception of portraitists and few history painters. Indeed, iconoclasm eliminated patronage from Calvinist churches and the commissions from the House of Orange were rare, though generous. The diplomat and poet Constantijn Huygens commissioned five works for the Stadholder from Rembrandt at the high price of 600 guilders each.<sup>16</sup> Other public authorities occasionally commissioned monumental paintings: Ferdinand Bol, Jan Lievens and Govert Flink received the remarkable compensation of 1500 guilders for each painting prepared for the Amsterdam Town Hall. More frequent were the direct commissions for group portraits: Rembrandt was paid at least 1600 guilders for his portrait of Captain Cocq and the other civic militia guards (the famous "Night Watch", now at the Rijksmuseum in Amsterdam). Most portraitists were, however, engaged in single figure portraits: Rembrandt was used to asking 50-100 guilders for a head and up to 500 for a full length portrait. However, the vast majority of painters sold their works at much lower prices in the open market: in their studios, through art dealers, at exhibitions and sales organized by the guild and at public sales (Montias 1987). For price evaluation in this primary market we do not have systematic information. What we know a lot about,

<sup>&</sup>lt;sup>14</sup>Some pupils paid up to 100 guilders a year (excluding board and lodging) to be trained by famous masters such as Rembrandt, Honthorst or Dou (North 1999, p. 65). To have an idea of the size of such an investment, Montias (1982) calculates that artists paid an average rent of 142 guilders a year, and bought houses of an average price of 1785 guilders.

<sup>&</sup>lt;sup>15</sup>There is an open debate on whether guilds were purely rent-seeking organizations or were transmitting human capital and insuring members' income so as to foster investment in innovation (Ogilvie 2004). On Dutch guilds, see Prak (2008).

<sup>&</sup>lt;sup>16</sup>Rembrandt asked double without success. However, he was later paid 1200 guilders for the *Adoration of the Shepherds* (1646, München, Alte Pinakothek) and the same for a *Circumcision*. Exports were rare, but we know that three paintings by Rembrandt were sent to Antonio Ruffo in Sicily for 500 guilders each. See Sluijter (2008). The same price was reached for a *Susanna*, while Lodewijk van Ludick paid 600 guilders for a *Nativity* and a *Circumcision* (Crenshaw 2006).

instead, is price evaluation in the secondary market, which will be the basis for our investigations.

The earliest data available on the price of paintings owned and traded in the Netherlands are from the beginning of the XVII century. Their first systematic investigation is due to Montias (1982), who examined inventories and auctions drawn from notarial records and estate papers of the *Orphan Chamber* in Delft between 1610 and 1679. A main finding of the study was that the composition of the collections changed drastically during the century. Half of the paintings were figurative in the first decade (1610-1619), a quarter were landscapes and a sixth were portraits, with a marginal presence of still life and genre paintings. In the last decade under consideration (1670-1679), landscapes represented 41 % of the paintings, still life paintings represented 17 %, all the figurative paintings represented another 17 %, portraits 15 % and genre paintings reached 7 % of all the paintings.<sup>17</sup>

Early investigations of the Amsterdam inventories are presented in Montias (1996) and Loughman and Montias (2001). The first work emphasizes a reduction in the average price of landscape paintings, conjecturing that this could be associated with an increase in productivity. The second work is entirely focused on the allocation of artworks between rooms of the Dutch houses, which is largely correlated with the quality of paintings. Our econometric analysis, controlling for all the objective features of the paintings and the proxies for quality, allows us to construct a bi-annual price index for the representative painting owned in Amsterdam during the Dutch Golden Age. This is based on our hedonic regressions for the price of paintings in Amsterdam inventories built in Section 3; we anticipate this inventories price index for the period 1616-1700 in Fig. 1. In Etro and Stepanova (2013), we have performed a similar hedonic analysis on auctions data, which are available for more limited periods (from Montias 2002), especially at the beginning of the century and in the final decades. In Fig. 1 we also report this auctions price index using the same reference period (1616-1617) to be able to appreciate the continuity between the two indexes in the period 1598-1700. The picture emphasizes a rapid increase in the real price of paintings at the beginning of the century, with a peak during the second decade,<sup>18</sup> and a subsequent decline of prices for the rest of the century. Our thesis is that the initially high prices may be related to the large increase in demand by the middle class taking place at the end of the XVI century and the beginning of the XVII century, which attracted a massive entry of painters looking for new opportunities. In turn, the increase in the number of painters strengthened competition, specialization in genres and induced process innovations, which may have led to the subsequent decline in prices.

<sup>&</sup>lt;sup>17</sup>Montias (1982) provided also a regression of the logprice of the value of art collections on a time trend and on the logarithm of the total value of the inventories as a proxy of the wealth of the art collectors. There was no evidence of a significant time trend, while the wealth elasticity was estimated at 1.23, suggesting that wealthier collectors were significantly increasing their share of artworks in their holdings. Montias (1996) estimated the same elasticity at 1.42 for Amsterdam in the period 1600-1669.

<sup>&</sup>lt;sup>18</sup>In 1609, the United Provinces concluded the twelve-year truce with Spain, reaching the *de facto* recognition of independence. Remarkably, this opened the door to trade with Flanders and, in particular, to the arrival of Flemish paintings, which probably contributed to the drop in price during the second decade of the XVII century. See Sluijter (2008).



Fig. 1 Price indexes in Amsterdam

# 1.1 Number of painters and art prices

To check our thesis, we display in Fig. 2 the number of painters active in Amsterdam in the period 1598-1700. The figures are derived from the dataset recently collected in the Ecartico project<sup>19</sup> and correspond to the total number of artists active in Amsterdam in each year. We report the ratio between number of painters and population in Amsterdam to control for scale effects.<sup>20</sup> Both figures show a clear pattern: the absolute and relative number of painters increased in an impressive way in the first two decades of the century, then kept increasing at lower rates until the middle of the century and after that, started to decrease for the rest of the century.

A comparison of the evolution of the number of painters and of the profitability of the market proxied by the real price of paintings suggests that high prices at the beginning of the century were probably responsible for the wide process of entry in the market, in line with evolutionary theories of entry such as those by Winter (1984) and Jovanovic and Lach (1989) and especially Klepper (1996). Typically, the number of producers grows rapidly at the beginning of the evolution of a market and then follows an inverse-U shape, with slow decline in the final development of the

<sup>&</sup>lt;sup>19</sup>For an interesting descriptive analysis of these data, see Rasterhoff (2012).

<sup>&</sup>lt;sup>20</sup>We know that population was about 30,000 in 1575, 60,000 in 1600, 105,000 in 1622, 120,000 in 1635, 140,000 in 1650, about 200,000 in 1675 and 1690, and 205,000 at the end of the century and we interpolated other values. See http://www.populstat.info/. The plagues of 1635 and 1663 caused sudden drops in population.

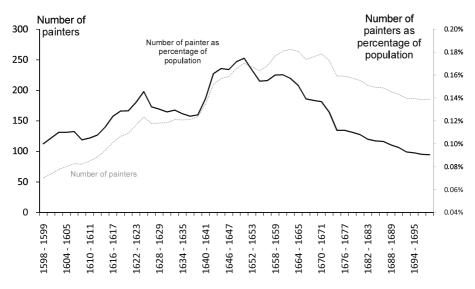


Fig. 2 Number of painters in Amsterdam

market.<sup>21</sup> Figures 1 and 2 show that, in our market, the peak in the number of painters takes place three decades later compared to the peak in the price index, which may reflect a slow feedback of profitability on entry decisions, possibly due to imperfect information, inertia in the expectations on profitability and, most of all, because of time-to-enter the market.

As long as the entry process was triggered by profitability calculated on the basis of industry experience over a short period of time (Winter 1984), we would expect that, in the short run, the net entry of painters should respond to price changes, that is, to changes in the expected rate of return from the profession. Of course, imperfect information and time to enter the profession (at least six years of apprenticeship for the ordinary artists, though the best ones could avoid completing it) would require a certain lag between price changes and entry (expressed as a rate of change of the number of active painters). It is hard to verify such a lagged relation comparing the number of painters and the price level in Figs. 1 and 2. Therefore, in Fig. 3 we compare the net entry of painters in Amsterdam, namely, the rate of increase in the number of painters, with the lagged inventory price index, namely, the price index of six years before.<sup>22</sup> What we find remarkable is that the positive correlation between the price index and the lagged rate of entry is evident already by visual inspection (correlation above 40 %). Testing the link between price changes and entry through time series analysis will be our main task in Section 4 and will confirm the existence of a causal link.

<sup>&</sup>lt;sup>21</sup>Recently, macroeconomic models with imperfect competition and endogenous entry (as, for instance, Etro and Colciago 2010) have reproduced similar patterns at the sectoral level.

<sup>&</sup>lt;sup>22</sup>Since the price index is bi-annual, three periods correspond to six years.

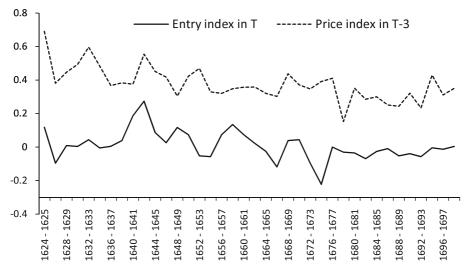


Fig. 3 Entry of painters and Price index in Amsterdam

# 1.2 Demand and supply effects on innovation

There is wide anecdotal evidence on how the demand for paintings increased between the end of the XVI century and the beginning of the XVII century and on how competition and artistic innovations increased the productivity of Dutch painters (see Prak 2008). On the demand side, it is well known that the emerging middle class started to accumulate art works and therefore increased demand for new paintings and paintings of new genres (Slive 1995). This attracted the entry of new painters in the market, leading to the first mass market for art in history. The same increase in prices at the beginning of the century could be seen as the result of a slow process of entry in the market in front of a rapidly increasing demand. Moreover, this induced a demand-pull process of artistic (product) innovation,<sup>23</sup> with the specialization of painters in new or renovated sub-genres such as still lifes of flowers, banquets, vanitas (symbolic still lifes), trompe l'oeil, seascapes, Italianate landscapes, conversation pieces, interiors, *tronies* (portraits of stock characters in costume) and others. New stylistic approaches were directly associated with groups of innovative painters, such as the Utrecht Caravaggists (such as Gerrit van Honthorst) who renovated genre paintings or the Fijnschilders (literally "fine-painters", such as Gerard Dou) who adopted a time-consuming style with meticulously executed small-scale works. This phase well resonates with intermediate phases of industry life cycles, where the number of product innovations tends to reach its peak when the number of producers is still increasing, and the most recent entrants account for a disproportionate share of

 $<sup>^{23}</sup>$ For a distinction between demand-pull and technology-push theories of technical change, see Dosi (1982).

327

product innovations (Klepper 1996, p. 565). The core of the Golden Age was reached in the middle of the century, when the number of painters reached its peak. Borrowing the terminology of the product life-cycle theory (Klepper 1996), the market was saturated and, after that, the number of painters started to decrease together with the prices.

On the supply side, the saturation of the market induced painters to focus on process innovations rather than artistic (product) innovations. Painters started to replicate the same compositions over and over, learning how to save time to reach a given quality level. Similarly, specialized painters tended to cluster in the same towns, fostering agglomeration economies and learning by doing in always more specific sub-genres (such as still lives of fish, tobacco pieces, merry companies and more). This was the case for landscapes in Haarlem, flowers in Middelburg, figurative paintings in Utrecht, genre paintings in Leiden, perspectives and townscapes in Delft. Only Amsterdam was too wide to allow for specialization in a single genre (see Prak 2008). All this created both internal and external scale economies, which led to cost and price reductions. Moreover, many low quality painters focused on imitation rather than innovation, which again increased substitutability between works and contributed to reduce prices. Another factor that may have contributed to downward pressure on prices was the introduction of cost-reducing innovations, such as the tonal style<sup>24</sup> and the same reduced size of paintings, especially for landscape and genre paintings.<sup>25</sup>

# 2 Dutch inventories and the evolution of art prices

In this section, we describe the sources used for the construction of our dataset, provide a statistical description of the data and present some preliminary results in support of the anecdotal evidence discussed above. We rely on two main sources: the inventories collected by John Montias in the archives of Amsterdam, now maintained at the *Frick Collection Research Center* (New York) and the inventories administrated by the *Getty Research Institute* (Los Angeles) collected by multiple scholars. The two datasets provide a representative sample of the collections between 1616 and 1700 from not only the upper class but also the middle class (collections of the low class did exist but were probably too small to be notarized; see Montias 1982,

<sup>&</sup>lt;sup>24</sup>Landscape painters Esaias van de Velde and Jan Porcellis introduced the tonal style, the execution of which could be more rapid (this made Porcellis able to write a contract in 1615 that bound him to produce forty paintings in twenty weeks). The same style was also adopted in still life paintings, as by Willem Claesz. Heda. Its main diffusion, however, was in the field of landscapes, where it was taken to the extreme by Jan van Goyen, Salomon van Ruysdael and Pieter de Molijn: they were said to take only one day to paint their pictures and therefore were able to reduce substantially the unitary price of their works. See Slive (1995).

<sup>&</sup>lt;sup>25</sup>However, as noticed by a referee, these innovations were not always associated with cheaper production: some landscapes (by Ruysdael or van de Velde) used a reduced color scale, as one would see it at dusk, but they were not monochromatic, and some other works were small to accommodate domestic spaces, but they were also more detailed.

1996). Prices are in guilders, stuivers and penningen and we have converted them in guilders.<sup>26</sup>

The typical record available contains year and place of the inventory, attribution of the painting, value assigned by the appraiser and the room in the house where the painting was placed. The original Dutch description of each painting was translated and analyzed to obtain dummies concerning the size (for about a third of the observations), classified as small or large (unfortunately, we do not have information on the exact size), the genre, the originality (copy and attribution to a painter) and more. In the Montias dataset we know the name of the owner with biographical details, including occupation and religious views, the date of the inventory, the city, the purpose of the inventory and the names of notaries and appraisers. We have selected the 347 inventories from Amsterdam, which contain 10,531 paintings. However, an investigation including inventories from other Dutch towns, such as Dordrecht, Haarlem and Utrecht, leads to very similar results (see Etro and Stepanova 2013). All the variables used in the regression analysis are listed in Table 1 together with their main statistics and the average price per category.

The average number of paintings per inventory increases constantly over the century from about 10 to almost 50 paintings, which confirms the idea that Dutch households increased demand for art during the century (Montias 1982). The art value of the collections of paintings varies from 2 to 36,724 guilders with an average value of 514 guilders and a median value of 201 guilders.<sup>27</sup> Remarkably, half of the collections have an average price below 8 guilders and 95 % of collections have an average price below 48 guilders, which supports the idea that this was becoming a *mass market*. The distribution of prices is characterized by a fat tail, with some paintings extremely expensive and a multitude of low value paintings (many priced below one guilder). The highest recorded prices are 1,500 guilders for *Christ and the Adulterous Woman* by Rembrandt (possibly the one today at the National Gallery in London)<sup>28</sup> and 800 and 700 guilders for two landscapes by Philip Wouwerman.

The most common purpose of the inventories is the division of property between heirs after the death of the owner. Art collections as part of inheritance were assessed normally by qualified appraisers (usually members of the guild of the painters) and certified by a notary. Paintings were often assessed in the case of being pledged as collateral for a loan or other kinds of debt and in the case of bankruptcy or insolvency of the debtor.<sup>29</sup> We have some useful information on the owners and therefore,

 $<sup>^{26}</sup>$ Prices are usually expressed as in the following example: f 2: 4: 6. This should be read as 2 guilders, 4 stuivers, 6 penningen. Notice that 20 stuivers (st.) correspond to a guilder (f.), and 16 penningen (pen.) amount to a stuiver.

<sup>&</sup>lt;sup>27</sup>To calculate the art value of the collections we took into account also the imported works and those of uncertain attribution.

<sup>&</sup>lt;sup>28</sup>This came from the inventory of the art dealer Johannes de Renialme (the most valuable in the dataset), who owned also other works by Rembrandt, Dou and Rubens at the top of the price distribution, evaluated respectively 600, 600 and 500 guilders.

<sup>&</sup>lt;sup>29</sup>Rembrandt went bankrupt in 1656, but we do not have evaluations from his inventory. Nevertheless, we know that the subsequent sale did not record high prices (Crenshaw 2006). As Schama (1999) notices, "the *Negro Heads* and *The Descent from the Cross*, a *Jerome*, an *Ox*, and a *Bittern*, a *Danae* and *The Concord of the State*, fifty or so paintings fetching altogether less than a thousand guilders".

Variable	Mean	Std. Dev.	Av.price (guilders)	Variable	Mean	Std. Dev.	Av.price (guilders)
Price (guilders)	15.70	38.48		Owner religion			
anonymous paintings	0.809	0.393	9.34	catholic	0.056	0.231	18.78
сору	0.032	0.176	6.66	protestant	0.311	0.463	20.73
large	0.033	0.179	50.23	jewish	0.004	0.067	1.65
small	0.303	0.460	7.01	unknown religion	0.628	0.483	13.04
Nr. of paintings	2.430	3.822		Owner occupation			
evaluated together				merchant large scale	0.205	0.403	23.54
				art dealer	0.064	0.244	51.61
Genre of the Painting				merchant retail	0.053	0.224	5.31
landscape	0.299	0.458	16.09	services	0.068	0.252	7.65
figurative	0.201	0.401	24.02	craft	0.04	0.197	6.21
portrait	0.138	0.345	13.69	artisan	0.04	0.196	10.18
still-life	0.090	0.287	14.33	artist	0.029	0.168	14.21
genre	0.082	0.274	18.69	manufacturer	0.024	0.152	13.97
unknown genre	0.190	0.392	7.12	employee	0.015	0.121	13.7
				regent	0.01	0.101	26.99
Placement in the house				unknown occupation	0.45	0.5	10.86
Private rooms	0.199	0.399	9.37	Inventory purpose			
Public rooms	0.084	0.277	28.25	death	0.543	0.498	16.79
Voorhuys	0.124	0.330	14.26	insolvency	0.048	0.213	20.74
Kitchen	0.020	0.141	7.68	collateral	0.023	0.151	23.58
unknown room	0.572	0.495	16.67	marriage	0.02	0.141	16.48
Number of rooms	4.970	4.300		unknown purpose	0.366	0.482	12.88

#### Table 1 Descriptive statistics

indirectly, on the demand for art. The occupation includes over a hundred different professions in the dataset, which we classified into ten general categories, useful as control variables for the income of the owners and, in general for demand conditions. The upper class of the Dutch society was composed of the regents, the large scale merchants and some large manufacturers: 43 % of the paintings, and by far the most expensive (excluding the art dealers), were owned by them. However, the middle class was also buying paintings, and the percentage of observations coming from middle class professions increases drastically over time (see Fig. 4) confirming the gradual development of the first mass market for art in history.<sup>30</sup>

The religion of the owner (Protestant, Catholic or Jewish) may be related to the demand of art and may have an impact on the composition of paintings in a collection. It could affect the propensity of collectors to hold religious paintings (the value of

<sup>&</sup>lt;sup>30</sup>This phenomenon was much more limited in contemporary markets as the Italian one (Spear and Sohm 2010) or the Spanish one (Etro and Stepanova 2016).

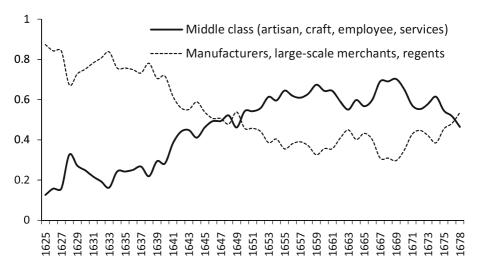


Fig. 4 Percentage of paintings belonging to the upper and middle class (10-years moving average)

which was generally higher): iconoclasm in the Reformed Church (started around 1566) led to the destruction and elimination of most of the religious paintings within churches and heavily affected the preferences of the citizens. As a consequence, this contributed to a drastic reduction in the possession of religious paintings, and, with them, of figurative paintings in general, as can be seen in Fig. 5.

The decline of demand for religious paintings was paralleled by an increasing demand for the new genres and sub-genres which were introduced and developed between the end of the XVI century and the beginning of the XVII century. We classify genres in figurative paintings, genre paintings, landscapes, portraits, still-life paintings and paintings of unknown genre. As shown in Fig. 5, landscapes become the prevailing genre during the century (and between the attributed paintings, they

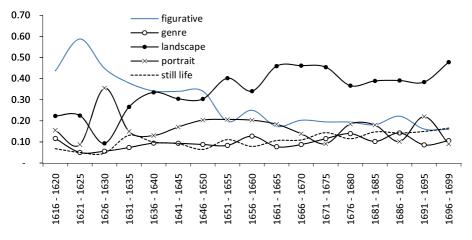


Fig. 5 Percentage of paintings by genres in the inventories

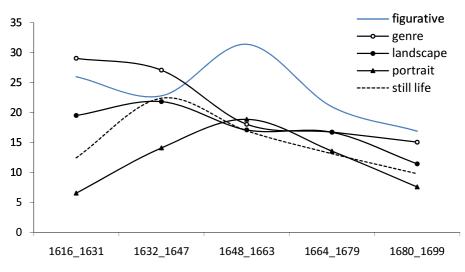


Fig. 6 Average price by genre in guilders

have an even larger share, reaching half of the paintings in the collections). This pattern confirms what was already found by Montias (1982) in Delft. Historians and art historians have argued that *nominal* price differentials between genres could be extremely large: "low-like scenes, barrack room and brotherl scenes, interior genre and "maidservant" pictures seem to have been the cheapest... An average price for a small landscape seems to have run between three and four guilders, and the same was true for a seascape (other than the grandiose battle pictures).. Still lifes also varied considerably with their size and subject...Portraits and history paintings (which appear less frquently after midcentury) were, as might be expected, the most expensive, and commissioned *portraits historiés* the most expensive of all" (Schama (1987, p. 318-9).

Economic history investigations on the evolution of prices in the Dutch Golden Age have been based on average *nominal* prices (see North 1999) and have emphasized a general increase in the price of most genres, especially in the last quarter of the century, and for genre paintings, figurative paintings and portraits, with an initial decline only for landscapes.<sup>31</sup> In contrast, we find that in the second half of the century, the average *real* prices (adjusted for inflation) tend to decrease for all genres (this emerges also from the evolution of the average nominal prices in Fig. 6). Moreover, the distribution in terms of prices shows a general tendency toward convergence

<sup>&</sup>lt;sup>31</sup>For instance, Chong (1987), focusing on a sample of high price paintings (excluding copies), has emphasized an average price of portraits increasing from 6 guilders in 1600-25, to 11 in 1626-50, 23 in 1651-75 and 37 in 1676-1700. The corresponding figures for genre paintings are 28, 22, 31 and 88 guilders, respectively, while still life paintings were priced 27, 30, 24 and 41 guilders in the four consecutive periods. Figurative paintings of religious subject moved from 33 guilders, to 43, 70 and 52. Finally, the price of landscapes moved from 30 guilders in 1600-25 to 22 in 1626-1650, 24 in 1651-1675 and 44 guilders in 1676-1700. Montias (1996) focused on landscapes drawn from two random samples of Amsterdam inventories, and showed a decline in the average nominal price of landscape paintings from 11.65 gulden in the period 1600-1619 (out of 64 observations) to 6.1 in the period 1650-1659 (out of 60 observations).

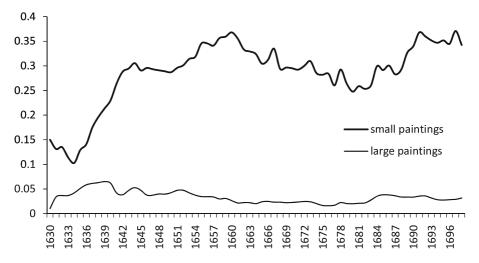


Fig. 7 Share of small and large paintings (10-years moving average)

between prices of different genres during the century, especially through a decline in the price of still life and genre paintings, but also of landscapes. The reduction in the price of landscapes was partly associated with a change in the characteristics of the paintings and higher productivity of the painters (Montias 1996) and partly due to the increasing supply, and so it will be important to verify such a convergence of prices across genres controlling for paintings' characteristics with econometric techniques.

Our dataset contains about four hundred different artists (the most frequent being Jan Miense Molenaer, Jan Porcellis, Roelandt Savery and Rembrandt). For two thirds of them we have more than one observation. The specialization of the Dutch painters in different genres and sometimes sub-genres was impressive. For most of the painters in our dataset, we have identified a single genre for their works, suggesting extreme specialization. Nevertheless, it is normal that some of them were occasionally engaged in different works: for the 261 artists with more than two observations in the dataset (excluding observations of unknown genre), we find that less than half (117) were diversifying their work among at least a couple of genres, only 45 between at least three genres, only 15 between four genres and only four artists have at least one painting in each genre within our dataset.

Another important trend emerging clearly from the Dutch inventories is a gradual reduction of the size of paintings over the century, which reflects a change in supply conditions. Even if precise measures of the paintings are not available, about a third of the descriptions in the inventories report whether the painting was "small" or "large". What we find is shown in Fig. 7: the share of paintings characterized explicitly as small paintings increases from around 15 % to 30-35 %, while the fraction of large paintings remains constant, suggesting that there was a rapid reduction of the average size of the new paintings entering in the collections. This could be in line with the idea that painters looked for cost savings innovations in their production activity: the

small size of paintings is one of them, because smaller paintings had a lower cost of production and could reach a wider audience at low prices.

Finally, for two thirds of the observations, we know the room of the house in which the painting was placed, which provides additional indirect information on the quality of paintings. Following Loughman and Montias (2001), we group rooms in *voorhuys* (the main entrance), other public rooms, private rooms and the kitchen.<sup>32</sup> Loughman and Montias (2001) found in a different dataset that paintings of large size, attributed to artists and described by subject in the inventory, were more frequent in public rooms. They also found that the specialization of rooms by subject was relatively weak, but they could not control for a number of factors in their descriptive analysis. Within our dataset, we confirm that public rooms and the *voorhuys* contained more expensive works (see Table 1) and that this pattern appears to be constant over time after controlling for other factors.<sup>33</sup> Besides its historical value, this suggests that paintings of different quality were placed in different spaces of the house, and so we will use this placement as an additional control variable for quality.

# **3** Hedonic regressions and the price index

In this section, we report the results of our main econometric investigation on art pricing in Table 2. The dependent variable is the logprice of paintings adjusted for CPI, so that the coefficients can be interpreted in terms of semi-elasticities. We present two regressions, the first of which is on the entire dataset available without artist fixed effects, but with a dummy for paintings the author of which is anonymous. A version of this regression has been used to derive the price index (of Figs. 1 and 9), replacing the time trend with time period dummies. The second regression is limited to the attributed paintings and contains fixed effects for each artist with at least two observations (omitting a reference group that contains all the artists with a single observation), which serve the purpose of controlling in the most precise way for the unobservable characteristics of the paintings. Selected artist fixed effects are reported in Table 3. We used the full set of control variables in both regressions.

 $<sup>^{32}</sup>$ To public rooms we attribute the main reception rooms such as the great hall (*saal*), the great room (*groote camer*) and the best room (*beste camer*), and the office (*comptoir*). To private rooms we attribute back (*achter-*) rooms, upstairs (*boven-*) rooms, the 'inner hearth' (*binnen camer*), and the sleeping and children rooms. We exclude from the classification the front (*voor-*) rooms and side (*zij-*) rooms, because their purpose is not generally clear and can change across houses, and all the rooms without any indication of their placement within the house.

<sup>&</sup>lt;sup>33</sup>In Etro and Stepanova (2013) we run a *multinomial Probit* model for the placement in different rooms controlling for the main painting characteristics, such as whether it was a copy or whether it was attributed to an artist, whether it was large or small, and its genre, including some sub-genres. Larger paintings were 18 % more likely to be placed in the *voorhuys* while smaller paintings were more likely to be in private rooms or in the kitchen. Attributed paintings were 9 % more likely to be displayed in public rooms, especially when they represented figurative subjects, while private rooms and kitchens tended to display lower quality paintings as, respectively, portraits and still life paintings.

	Baseline OLS		OLS regression	
	regression		on attributed pa	untings
Year	$-0.008^{***}$	(0.001)	$-0.014^{***}$	(0.002)
Real wage	0.003	(0.002)	0.002	(0.004)
Artist fixed effects			(YES)	
Anonymous	$-1.179^{***}$	(0.028)	-	
Сору	-0.621***	(0.058)	$-0.985^{***}$	(0.089)
Large size	0.815***	(0.056)	0.661***	(0.097)
Small size	$-0.491^{***}$	(0.023)	$-0.578^{***}$	(0.046)
Nr. paintings evaluated	-0.049***	(0.003)	-0.164***	(0.030)
Genre of the Painting				
unknown genre	omitted		omitted	
landscape	0.671***	(0.031)	0.005	(0.074)
figurative	0.742***	(0.034)	0.121	(0.082)
portrait	0.344***	(0.036)	$-0.207^{**}$	(0.102)
still-life	0.524***	(0.042)	-0.033	(0.116)
genre	0.640***	(0.043)	-0.021	(0.093)
Placement of the Painting				
unknown room	omitted		omitted	
private rooms	-0.093***	(0.027)	-0.423***	(0.065)
public rooms	0.368***	(0.037)	-0.066	(0.075)
voorhuys	0.127***	(0.032)	-0.122	(0.074)
kitchen	-0.322***	(0.072)	-0.339*	(0.176)
Number of rooms	-0.002	(0.003)	0.024***	(0.005)
Av. price rest of collection	0.029***	(0.001)	0.016***	(0.001)
Owner religion				
unknown religion	omitted		omitted	
catholic	$-0.169^{***}$	(0.048)	0.034	(0.117)
protestant	$-0.104^{***}$	(0.028)	0.016	(0.067)
jewish	-0.408**	(0.160)		
Owner occupation				
unknown occupation	omitted		omitted	
merchant large scale	0.115***	(0.034)	0.032	(0.081)
art dealer	0.128**	(0.059)	-0.045	(0.105)
merchant retail	$-0.445^{***}$	(0.050)	$-0.742^{***}$	(0.146)
services	$-0.097^{**}$	(0.046)	-0.273**	(0.131)
craft	-0.521***	(0.057)	-0.324***	(0.116)

# Table 2 Price regressions

	Baseline OLS regression		OLS regression on attributed pai	ntings
artisan	-0.346***	(0.055)	-0.300***	(0.105)
artist	0.081	(0.066)	-0.151	(0.158)
manufacturer	-0.015	(0.070)	-0.058	(0.152)
employee	0.057	(0.085)	-0.162	(0.171)
regent	0.517***	(0.103)	0.112	(0.185)
Inventory purpose				
unknown purpose	omitted		omitted	
death	$-0.240^{***}$	(0.033)	0.127*	(0.066)
insolvency	-0.249***	(0.054)	-0.004	(0.127)
collateral	0.246***	(0.073)	-0.032	(0.131)
marriage	0.267***	(0.081)	0.320*	(0.189)
Constant	15.232***	(1.360)	26.529***	(3.585)
Observations	10 525		2 007	
Adjusted $(R^2)$	0.54		0.60	

#### Table 2 (continued)

\* p < 0.1, \*\* p < 0.05, \*\*\* p < 0.01 Standard errors in parentheses

## 3.1 The main determinants of art prices

Our main macroeconomic control variable, the real wage, is positively correlated with prices but the relation does not appear to be significant (and omitting this control does not change any of the results). An obvious rationale for this is that the price of a painting in the secondary market reflects its value as an asset, which is largely independent from the short run behavior of the economy; the same occurs in data from Dutch auctions of the same period (see Etro and Stepanova 2013).

In both the baseline regression and in the one on attributed paintings, price estimates are reduced when more paintings are evaluated jointly (for a sort of quantity discount), when they are copies (because cost and quality tend to be lower) and when they are of a small size.<sup>34</sup> As expected, the baseline regression emphasizes drastic price differentials between anonymous paintings and attributed ones. As mentioned above, the placement of paintings in the house was correlated with the quality of the work, and indeed we find that placement in private rooms and in the kitchen was associated with lower prices compared to paintings displayed in the entrance and in public rooms.

<sup>&</sup>lt;sup>34</sup>It is important to remark that we do not have precise data on the size of paintings, and we could only classify a third of them as small or large compared to the average size (when mentioned in the description of the painting). However the variability in size was lower in home collections compared to paintings destined to public commissions (which could be much larger).

Table 3 Artists fixed effects

Name	Coef.	St.err.	obs.	Name	Coef.	St.err.	obs.
HEEM, JAN DAVIDSZ. DE(1606-1683)	$1.797^{***}$	(0.356)	s	WITTE, EMANUEL DE(1617-1692)	$0.794^{***}$	(0.236)	12
METSU, GABRIEL(1629-1667)	$1.728^{***}$	(0.454)	3	DYCK, ANTHONIE VAN(1599-1641)	$0.780^{**}$	(0.326)	9
BRIL, PAUL(1554-1626)	$1.644^{***}$	(0.355)	5	PYNACKER, ADAM(1622-1673)	$0.777^{***}$	(0.3)	7
BEUCKELAER, JOACHIM(1533-1574)	$1.629^{***}$	(0.556)	3	SPRANGER, BARTHOLOMEUS(1546-1611)	$0.760^{*}$	(0.455)	4
JORDAENS, JACOB(1593-1678)	$1.449^{***}$	(0.299)	7	COLLAERT, JOHANNES(1622-1678)	$0.746^{*}$	(0.391)	4
HOLBEIN, HANS (II)(1497-1543)	$1.380^{***}$	(0.327)	9	BRUGGHEN, HENDRICK TER(1588-1629)	$0.729^{*}$	(0.392)	4
SNYDERS, FRANS(1579-1657)	$1.240^{***}$	(0.363)	5	SCOREL, JAN VAN(1495-1562)	$0.701^{*}$	(0.398)	4
BORCH, GERARD TER (II)(1617-1681)	$1.236^{***}$	(0.452)	ю	KEY, WILLEM(1515-1568)	$0.694^{***}$	(0.24)	13
MARSEUS VAN SCHRIECK, OTTO(1619-1678)	$1.168^{***}$	(0.259)	10	VRIES, HANS VREDEMAN DE(1527-1606)	$0.648^{*}$	(0.362)	5
KONINCK, SALOMON DE(1609-1656)	$1.093^{***}$	(0.243)	13	HOOCH, PIETER DE(1629-1684)	$0.627^{**}$	(0.29)	8
BERCHEM, CLAES PIETERSZ.(1620-1683)	$1.074^{***}$	(0.354)	5	BACKER, JACOB ADRIAENSZ.(1609-1651)	$0.611^{*}$	(0.323)	9
DOU, GERARD(1613-1675)	$1.073^{***}$	(0.357)	5	CORNELISZ. VAN HAARLEM, C.(1562-1638)	$0.593^{***}$	(0.171)	26
BACKHUYSEN, LUDOLF(1630-1708)	$1.067^{***}$	(0.351)	5	RUISDAEL, JACOB ISAACKSZ.(1628-1682)	$0.586^{***}$	(0.216)	15
RUBENS, PIETER PAUL(1577-1640)	$1.057^{***}$	(0.243)	11	LINGELBACH, JOHANNES(1622-1674)	$0.584^{***}$	(0.207)	16
LEYDEN, LUCAS VAN(1494-1533)	$1.020^{***}$	(0.324)	9	BRUEGEL, JAN (I)(1568-1625)	$0.582^{**}$	(0.256)	10
BOSCH, PIETER VAN DEN(1614-1670)	$1.002^{**}$	(0.401)	4	HEDA, WILLEM CLAESZ.(1593-1681)	0.581	(0.4)	4
HONTHORST, GERRIT VAN(1592-1656)	$0.996^{**}$	(0.396)	4	GELDORP, GORTZIUS(1553-1618)	$0.576^{*}$	(0.333)	9
ASSELYN, JAN(1610-1652)	$0.952^{**}$	(0.393)	4	LIEVENS, JAN (I)(1607-1674)	$0.572^{***}$	(0.15)	35
BALEN, HENDRICK VAN (I)(1575-1632)	$0.909^{**}$	(0.357)	5	FLORIS, FRANS (I)(1520-1570)	0.565**	(0.268)	6
BOUT, PEETER(1658-1719)	0.907**	(0.418)	4	FRANCKEN, FRANS (II)(1581-1642)	$0.562^{*}$	(0.333)	9
VELDE, ADRIAEN VAN DE(1636-1672)	$0.891^{**}$	(0.35)	5	VRANCX, SEBASTIAN(1573-1647)	$0.546^{**}$	(0.258)	10
VERTANGEN, DANIEL(1601-1683)	$0.884^{***}$	(0.162)	30	BOL, FERDINAND(1616-1680)	0.522	(0.323)	9
REMBRANDT VAN RIJN(1606-1669)	$0.868^{***}$	(0.15)	36	FLINCK, GOVAERT(1615-1660)	0.52	(0.327)	9

Table 3(continued)

Name	Coef.	St.err.	obs.	Name	Coef.	St.err.	obs.
VENNE, ADRIAEN PIETERSZ.(1580-1662)	0.820***	(0.285)	×	BOTH, JAN(1614-1652)	0.466	(0.329)	9
WTEWAEL, JOACHIM(1566-1638)	$0.810^{***}$	(0.309)	٢	GRONINGEN, SWART JAN, VAN(1495-1563)	0.418	(0.287)	8
BOTH, ANDRIES DIRCKSZ.(1611-1642)	$0.805^{**}$	(0.392)	4	CAPPELLE, JAN VAN DE(1626-1679)	0.414	(0.333)	9
LASTMAN, PIETER(1583-1633)	$0.799^{**}$	(0.35)	5	SAVERY, ROELANDT(1576-1639)	0.395***	(0.152)	37
PORCELLIS, JAN (I)(1584-1632)	$0.381^{***}$	(0.139)	44	VROOM, HENDRICK(1562-1640)	-0.11	(0.207)	17
POELENBURGH, CORNELIS VAN(1594-1667)	$0.373^{*}$	(0.202)	17	HALS, FRANS(1582-1666)	-0.139	(0.271)	6
VINCKBOONS, DAVID(1576-1632)	0.37	(0.289)	8	PEETERS, BONAVENTURA(1614-1652)	-0.172	(0.212)	17
NEER, AERTVAN DER(1603-1677)	$0.361^{**}$	(0.184)	23	PYNAS, JACOB SYMONSZ.(1592-1650)	-0.178	(0.238)	12
WOUWERMAN, PHILIPS(1619-1668)	$0.340^{*}$	(0.187)	21	DROOCHSLOOT, JOOST C.(1586-1666)	-0.182	(0.281)	8
TENIERS, DAVID (II)(1610-1690)	0.315	(0.352)	9	MOLENAER, JAN MIENSE(1610-1668)	-0.188	(0.129)	99
HEYDEN, JAN VAN DER(1637-1712)	0.301	(0.323)	9	GOYEN, JAN JOSEPHSZ. VAN(1596-1656)	-0.201	(0.174)	24
AERTSEN, PIETER (LANGE PIER)(1508-1575)	0.284	(0.194)	19	BROUWER, ADRIAEN(1605-1638)	-0.224	(0.233)	13
VLIEGER, SIMON DE(1601-1653)	0.28	(0.185)	21	WYCK, THOMAS(1616-1677)	-0.247	(0.281)	8
MOLENAER, CLAES(1626-1676)	0.278	(0.301)	7	SCHELLINKS, WILLEM(1627-1678)	-0.271	(0.301)	7
BARENDSZ., DIRCK(1534-1592)	0.26	(0.356)	5	VELDE, ESAIAS VAN DE(1587-1630)	-0.371	(0.228)	13
BLOEMAERT, ABRAHAM(1566-1651)	0.257	(0.237)	12	TROYEN, ROMBOUT VAN(1605-1655)	$-0.424^{***}$	(0.164)	32
CRANACH,LUCAS(1472-1553)	0.209	(0.335)	9	HALS, DIRCK(1591-1656)	$-0.488^{*}$	(0.26)	11
MOSTAERT, GILLIS(1528-1598)	0.171	(0.298)	7	MARSEUS VAN SCHRIECK, EVERT(1619-1678)	$-0.522^{*}$	(0.285)	8
MOUCHERON, FREDERICK DE(1633-1686)	0.164	(0.304)	7	CLAESZ., PIETER(1597-1660)	$-0.530^{**}$	(0.215)	17
RUYSDAEL, SALOMON VAN(1602-1670)	0.164	(0.306)	٢	MANDER, KAREL VAN(I)(1548-1606)	-0.562*	(0.3)	7
CAMPHUYSEN, GOVERT DIRCKSZ.(1624-1672)	0.151	(0.199)	18	MOLIJN, PIETER DE(1595-1661)	$-0.567^{***}$	(0.186)	20
EVERDINGEN, ALLART VAN(1621-1675)	0.149	(0.154)	34	MOMPER, JOOS DE(1564-1635)	$-0.588^{***}$	(0.154)	33
HONDECOETER, GILLIS DE(1577-1638)	0.134	(0.166)	28	DOES, JACOB VAN DER (I)(1623-1673)	$-0.648^{*}$	(0.391)	4

(continued)	
Table 3	

Name	Coef.	St.err.	obs.	obs. Name	Coef.	St.err.	obs.
HEEMSKERCK, MAERTEN VAN(1498-1574)	0.128	(0.309)	Ζ	QUAST, PIETER JANSZ.(1606-1647)	$-0.662^{**}$	(0.258)	10
SEGHERS, HERCULES (1589-1638)	0.125	(0.166)	35	GRIMMER, JACOB(1526-1590)	$-0.724^{*}$	(0.395)	4
PYNAS, JAN SYMONSZ.(1582-1631)	0.112	(0.233)	12	HEER, GERRIT ADRIAENSZ.DE(1606-1664)	$-0.815^{**}$	(0.39)	4
KONINCK, PHILIPS DE(1619-1688)	0.097	(0.253)	10	MOEYAERT, CLAES CORNELISZ.(1592-1655)	$-0.843^{***}$	(0.324)	9
AVERCAMP, HENDRICK(1585-1634)	0.047	(0.353)	5	VRIES, GUILLIAM DE(1624-1678)	$-0.865^{***}$	(0.317)	Ζ
CODDE, PIETER JACOBS(1599-1678)	0.047	(0.258)	10	LANG, WILLEM ARENTSZ. DE(1590-1626)	$-0.914^{**}$	(0.402)	4
CONINCXLOO, GILLIS VAN(1544-1607)	-0.06	(0.258)	10	FRIS, JAN(1627-1672)	$-0.964^{**}$	(0.453)	ю
WILLAERTS, ADAM(1577-1664)	-0.07	(0.3)	٢	VONCK, ELIAS(1605-1652)	$-1.075^{***}$	(0.258)	11
VICTORS, JAN(1619-1679)	-0.1	(0.301)	٢	GRAS, WILLEM(1620-1680)	$-1.257^{***}$	(0.41)	4
* $p < 0.1$ , ** $p < 0.05$ , *** $p < 0.01$ Standard errors in parentheses	rors in paren	theses					

Let us move to the variables related to the owners. The number of rooms in the house could be seen as a proxy of the wealth of the owner or possibly of other characteristics of the collection (average size of paintings, number of paintings) and is positively correlated with prices, at least in the full specification. Of course, we cannot control for all of the qualitative characteristics of the paintings, and some collections were simply more valuable because the owners had a higher preference or willingness to pay for art or for more valuable paintings. To capture these residual unobservable aspects, we control for the average price of the (other) paintings present within each collection. For this reason we have excluded from the regressions the few inventories with a single painting. As one would expect, the relation is positive and significant (even if of limited magnitude, suggesting that our control variables account already for a lot of variability in prices) and the coefficient is reduced when we control for the artists fixed effects.<sup>35</sup>

We have more information indirectly related to both income and preferences of the owners, such as their job and their religion. In the baseline regression we emphasize higher prices for paintings belonging to the upper class, namely, regents, large merchants and art dealers, compared to typical professions of the emerging middle class (retail merchants, workers in services, craftsmen and artisans). Catholics and Jewish collectors appear to have paintings with a lower average price (iconoclasm may have led Protestants to purchase higher quality paintings without a religious content). However, most of these correlations lose significance or are reduced when we control for the artists fixed effects, in line with the expectation that the evaluation of a painting with given characteristics should not strictly depend on its owner. It is remarkable that similar results emerge also within contemporary auctions, analyzed in Etro and Stepanova (2013). They are in line with the idea that, in a competitive secondary market, prices were independent from the identity of the traders: richer buyers were purchasing more expensive paintings, but there is no reason why they should pay more for a painting of given characteristics.

Another interesting piece of evidence is about the purpose of the inventory. Again, this may be correlated with prices, but the evaluation of paintings of a given quality should not be largely affected by the purpose of the same evaluation. Indeed, in the baseline regression we find higher prices in inventories prepared for a marriage and prepared as collateral for the creditors. This may reflect positive selection effects: owners selected better paintings for these purposes or decided to organize inventories when they had paintings by better artists to use for these purposes. In contrast, prices appear lower in inventories due to the insolvency of the owner or after the death of the owner. This may reflect negative selection effects: debtors and heirs were forced to record all paintings including those by painters of lesser skill. Nevertheless, once again, these correlations tend to lose significance after controlling for quality through the artists' fixed effects.

Price differentials between different genres appear to be extremely wide even when we control for the main features of paintings and owners. We compared the five

<sup>&</sup>lt;sup>35</sup>Controlling for the average price of painting in the collections can be problematic if there is a limited heterogeneity between collections, which is not the case in this dataset. However, the other results are robust when we omit this control.

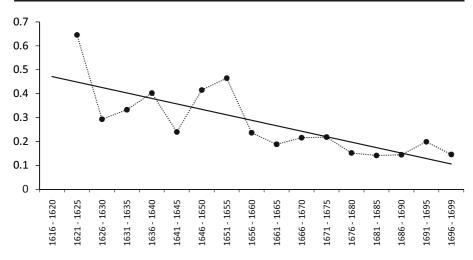


Fig. 8 Convergence of prices for different genres over time (standard deviation of returns between genres)

main genres with the omitted category of paintings the genre of which is unknown. Our baseline regression shows that figurative paintings were evaluated 110 % more than the reference group, landscape and genre paintings 96 % and 90 % more, still life paintings 69 % more and portraits were evaluated 41 % more than the omitted group. Remarkably, these differences almost disappear when we control for the unobservable characteristics of the painters, with the only exception of portraits that are evaluated 18 % less of the paintings of unknown genre.<sup>36</sup> This could suggest that, after taking into account quantitative aspects of the paintings and unobservable quality of the painters, most of the price differentials between genres were negligible. This is in line with what found in the primary market for paintings during the same century in Rome by Etro et al. (2015). Here, however, we are looking at a secondary market, where price differentials between genres due to changes in preferences could persist even if they were absent in the primary market: more precisely, price differentials in the secondary market could induce adjustments in the production of different genres in the primary market, but this would lead to price convergence only gradually in the secondary market. This is exactly what we find when we look at the convergence of the price indexes by genre, as reported in Fig. 8, where we show the standard deviation of price changes across genres. This fact suggests that there was a pattern of  $\sigma$ -convergence of prices between genres. Summing up, in contrast with what emerges from descriptive statistics where these differentials are large (Montias 1982, 2002), we find that, after we control for the unobservable quality of paintings (with artists fixed effects), price differentials tend to disappear over time.

<sup>&</sup>lt;sup>36</sup>One should notice that portraits were penalized in the evaluation of the secondary market since the value for the commissioner was higher than the value for another collector.

## 3.2 Artists' fixed effects

We finally look at the artists fixed effects found in the full specification (see Table 5). The omitted category (relative to which we should read all the other coefficients) is the group of over a hundred artists with a single observation, and so the ranking of fixed effects is the relevant aspect to notice (as opposed to the absolute coefficients). Some of the painters with high reputation nowadays appear between the best, but they are sometimes intermingled with painters of much lower reputation, which was probably due to a different perception of quality at the time relative to today. Nevertheless, the best paid figurative painters include some of the most innovative Flemish and Dutch masters from the XVII century such as Jacob Jordaens, Pieter Paul Rubens, Pieter Lastman and Rembrandt,<sup>37</sup> but also old masters such as Lucas van Levden and the German painter Hans Holbein, or famous mannerist artists such as Joachim Beuckelaer, Joachim Wtewael, Bartholomeus Spranger and others. The painter and biographer Karel van Mander provides us with some anecdotal information on mannerist artists consistent with our findings: according to vanMander (1604), Beuckelaer's works fetched low prices during his lifetime, but after his death they increased in value twelvefold,<sup>38</sup> Spranger was used to receiving high rewards for small works, Willem Key was so highly esteemed that once he received forty guilders for a portrait of a cardinal without having asked anything, and Frans Floris was so appreciated in the market that he could make a thousand guilders per year, a fortune in the XVI century.

The best landscapists include Paul Bril, Jan Asselyn, Claes Berchem, Emanuel de Witte and, a step behind, Jacob Ruisdael and Jan Brueghel. It is remarkable that some famous landscape painters who adopted the tonal style, such as Jan van Goyen, Pieter de Molijn, Salomon van Ruysdael and Simon de Vlieger, do not have an evaluation that is significantly higher than average (and the coefficient is relatively low also for Jan Porcellis): their increased productivity was probably associated with lower unitary prices. Top genre painters included Gabriel Metsu, Gerard Ter Borch, Gerard Dou, two Caravaggists as Gerrit van Honthorst and Hendrick ter Brugghen and, only behind, Pieter de Hooch. The best paid still life paintings were by Jan de Heem, Otto Marseus van Schrieck and the Flemish Frans Snyders, while prices for the tonal paintings of banquets by Willem Claesz. Heda and Pieter Claesz. were not significantly higher than average. Finally, distinguished portraitists included Rembrandt and Antoine van Dyck, as one would expect, while we confirm the well known fact that the Harleem specialist Frans Hals did not reach high prices for his portraits.<sup>39</sup>

<sup>&</sup>lt;sup>37</sup>As is well known, Rubens organized his workshop as a real enterprise, exploiting a large number of collaborators to produce an impressive amount of well paid works.

<sup>&</sup>lt;sup>38</sup>We tried to test for death effects, but the dataset is too limited to identify clear patterns.

<sup>&</sup>lt;sup>39</sup>According to Schama (1999, p. 330-331), this could be a matter of local taste: "while we recognize the universal quality of Hals' élan vital, in 1630 it probably seemed merely the best specimen of a parochial Haarlem-style... The Hals style certainly appealed to some Amsterdammers, since they would commission him to paint one of their militia companies. But it's not hard to imagine the plutocrats who now disdained the bulk for the "fine" trades considering Hals's brassy ebullience as fit for the brewers and linen bleachers of Haarlem, but not for what they supposed to be their own more elegant fashion."

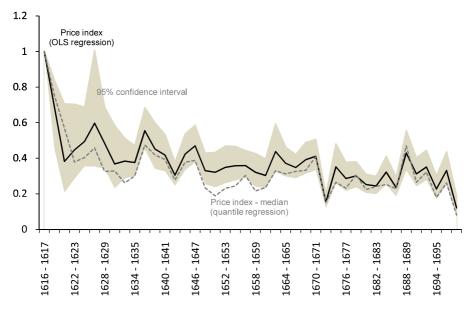


Fig. 9 Price index in Amsterdam (1616-1700)

# 3.3 The price index for Dutch paintings

Both our main regressions in Table 2 emphasize a negative trend of the relative price of a representative painting (that is, controlling for its characteristics as much as we can) in the last part of the century. To provide a more precise account of the temporal trend of the relative prices, we have re-run the baseline regression replacing the linear trend with a set of time-period (bi-annual) dummies. This allows us to build a standard hedonic price index (given by the antilogs of the coefficients on the time-period dummies) shown in Fig. 9 with its 95 % confidence interval.<sup>40</sup> Since the price distribution is characterized by a fat tail, we also run a quantile regression to confirm that the median price has a similar behavior as the average price: Fig. 9 reports this index which appears largely in line with the baseline index.

The negative trend of prices resonates well with the anecdotal evidence for which, after a boom at the beginning of the century, the return from the artistic profession gradually decreased during the late Golden Age. Many Dutch painters of the Golden Age had to turn to a second profession: van Goyen traded in tulips, van de Velde in linen, Steen and Aert van der Velde were innkeepers, Pieter de Hooch was a servant and Hobbema a tax collector. Rembrandt went bankrupt in 1656, in part because, at the peak of his success, he bought a house that he could not afford to pay for with his subsequent earnings (Crenshaw 2006) and, probably, because he kept investing in art (even buying back his own prints in the vane attempt to increase their price) in a period in which prices were declining. Many other painters went bankrupt (for

<sup>&</sup>lt;sup>40</sup>This is the same inventory price index of Fig. 1.

343

instance, Roelandt Savery, Jan Porcellis, Jan Weenix or Pieter Potter), while Frans Hals escaped this but was constantly in debt with a variety of shopkeepers.<sup>41</sup> This is consistent with our finding that the real profitability of paintings kept decreasing over the second part of the century.

The price index emphasizes also a cycling behavior around its trend, and this must have been largely related to aggregate shocks. For instance, the price drop of 1672 corresponded to the so called "year of calamites", in which England and France joined in a secret pact to start a war against the Dutch Republic. Given the importance of aggregate shocks on art prices, our last inquiry tries to exploit these exogenous sources of uncertainty, looking at the impact that price fluctuations exerted on the entry of painters in the short run.

# 4 Time series analysis

An important determinant of the decision to become a painter is the expected profitability of the profession, which is reflected in the growth of the price of paintings relative to the cost of living. As we have argued, the high prices of the beginning of the century and their subsequent decline are broadly compatible with the initial increase of the number of painters and the subsequent decrease (Figs. 1 and 2). However, any attempt at finding causality should depart from a long run perspective and look at the link between profitability and entry in the short run: whenever the return from the profession was expected to be high, new artists would enter in the market, making it more likely that artistic innovations could be developed and introduced. In this sense, we can look at the artistic sector as a Schumpeter Mark I sector where innovations are mainly associated with the entry of new artists to replace older styles in a typical process of "creative destruction" (see Winter 1984). Of course, imperfect information and time-to-enter in the market should be taken into account, leading to some delay in the feedback on entry. This is in line with evolutionary models of entry (Winter 1984), as well with models of the industry life cycle (Klepper 1996, 2002).

In this section, we provide a preliminary test of this hypothesis looking at the time series properties of our data. On one side, we expect that an increase in the price level  $P_t$  should attract entry and lead to a higher number of painters  $N_t$  after a few years (an *endogenous entry hypothesis*), and, on the other side, an increase in the number of painters could determine more competition and (possibly) the introduction of process innovations, leading quickly to lower prices in the primary market and lower returns on paintings in the secondary market (a *competition hypothesis*).<sup>42</sup> To test these hypothesis, we look jointly at the data on the rate of entry of painters

<sup>&</sup>lt;sup>41</sup>As noticed by Hauser (1951, Vol. II), "not only Rembrandt and Hals, but also Vermeer, the third leading painter in Holland, had to fight against material worries. And the other two greatest painters of the country, Pieter de Hooch and Jacob van Ruisdael, were also not highly esteemed by their contemporaries and by no means among the artists leading a comfortable life. The epic of Dutch painting is not complete unless one adds that Hobbema had to give up painting in the best years of his life."

<sup>&</sup>lt;sup>42</sup>See Etro and Colciago (2010) for a model of dynamic entry with imperfect competition between an endogenous number of differentiated producers.

 $E_t = \Delta N_t$  and on price changes  $R_t = \Delta P_t$  as derived from our inventory price index and check for Granger causality in both directions: a variable *R* is said to Grangercause a variable *E* if the expectation of  $E_t$  conditioning on both the history of *R* and  $E, \{R_{t-s}\}_{s=1}^t$  and  $\{E_{t-s}\}_{s=1}^t$ , differs from the conditional expectation of  $E_t$  given its past history alone.<sup>43</sup> As is well known, Granger causality does not imply causality in the standard sense. However, we hardly see other (non-causal) mechanisms that could associate an increase in prices of paintings with a subsequent increase in the number of active painters.

We follow the standard Box and Jenkins (1970) procedure and consider the relation between two time series:  $E_t$  is the bi-annual rate of entry of painters in Amsterdam and  $R_t$  is the bi-annual change of the inventory price index.<sup>44</sup> Both time series are stationary: i.e. Dickey-Fuller tests show that time series do not have unit-roots. Three lags are optimal according to the Akaike information criterion, final prediction error and the Hannan and Quinn information criterion. Post-estimation tests of normal distribution of residuals and the absence of autocorrelation in residuals are applied to validate the VAR model (Table 4).

In line with our conjecture, we find Granger causality in both directions (Table 4), that is, an increase in prices Granger-causes positive changes in entry of painters (the relationship is significant at 1 %), and an increase in entry Granger-causes negative changes in the price of paintings (the relation is significant at 5 %). Causality from price changes to entry is not immediate, but appears at the third lag, which means after six years. This is remarkably in line with what one would expect: it can be interpreted in terms of the few years of training that were needed for a young apprentice to become a painter and enter the profession officially (and our dataset). Causality from entry to prices, instead, is immediate, with a large negative impact on the subsequent prices. All this supports the endogenous entry hypothesis for which profitability induces business creation in the art sector, but subsequently, entry strengthens competition so as to reduce prices (Table 5).<sup>45</sup>

As a robustness check, we run a VAR model for time-series of lower frequencies (5-years time steps instead of bi-annual), and we find causality in both directions in

$$\mathbb{E}\left\{E_{t} \mid \{E_{t-s}\}_{s=1}^{t}, \{R_{t-s}\}_{s=1}^{t}\right\} \neq \mathbb{E}\left\{E_{t} \mid \{E_{t-s}\}_{s=1}^{t}\right\}$$

where  $\mathbb{E}\left[\cdot\right]$  is the expectation operator. The concept is operationalized by estimating a model of the form:

$$E_t = \alpha_0 + \sum_{s=1}^{L} \alpha_s E_{t-s} + \sum_{s=1}^{L} \beta_s R_{t-s} + \varepsilon_t$$

and testing the null hypothesis:

$$H_0 = \bigcup_{s=1}^{L} \left(\beta_s = 0\right)$$

where *L* is the number of lags. See Granger (1969), Engle and Granger (1987) and Sims et al. (1992). <sup>44</sup>Similar results would emerge using the auction price index that covers a limited time period. However, this is based on more limited data and control variables. For this reason we focus on the inventory price index.

<sup>45</sup>We run the same analysis using the percentage of painters in the population obtaining very similar results.

<sup>&</sup>lt;sup>43</sup>In other words *R*, Granger causes *E* if:

Lagged variables	Returns equat	ion $R_t$	Entry equation	Entry equation $E_t$	
$R_{t-1}$	-0.83***	(0.16)	0.05	(0.04)	
$R_{t-2}$	-0.35**	(0.17)	-0.01	(0.04)	
$R_{t-3}$	-0.43***	(0.15)	0.09**	(0.04)	
$E_{t-1}$	-1.74***	(0.59)	0.81***	(0.15)	
$E_{t-2}$	1.11	(0.68)	-0.55***	(0.17)	
$E_{t-3}$	-0.40	(0.60)	0.42***	(0.15)	
Constant	2.70***	(0.39)	-0.13	(0.09)	
Observations	38		38		
$R^2$	0.49		0.48		
Jarque-Bera normality test					
$(\chi^2 \text{ with 2 d.f.})$	0.41		1.01		

#### Table 4 VAR estimation results

\*\* p < 0.05, \*\*\* p < 0.01 Standard errors in parentheses

this case. We also follow the approach of Toda and Yamamoto (1995), which does not depend on the cointegration properties of the system and allows us to run the VAR in evels, namely, number of painters  $N_t$  and prices  $P_t$  (see Table 5). In this case, we reject the null hypothesis of absence of Granger-causality running from prices to the number of painters: an increase in prices Granger-causes a positive change in the number of painters as the sum of lagged coefficients is positive, and the relationship is significant at 1 % level. However, causality running in the opposite direction is not confirmed. Therefore, the strong causal relation appears to be the one going from prices to endogenous entry.

Granger G	ausality test				
From	То	Wald statistics	<i>p</i> -value	Sum of lagged	Causality
		( $\chi^2$ with 3 d.f.)		coefficients	
R	Е	12.661	0.005	0.13	$R \rightarrow E^{***}$
Е	R	8.807	0.032	-1.03	$E \rightarrow R^{**}$
Toda and	Yamamoto a	pproach			
From	То	Wald statistics	<i>p</i> -value	Sum of lagged	Causality
		$(\chi^2 \text{ with 4d.f.})$		coefficients	
Р	Ν	13.805	0.008	0.02	$P \rightarrow N^{***}$
Ν	Р	3.806	0.433	0.00	None

Table 5 Classical approach (Box and Jenkins)

\*\*\* , \*\* denote significance at 1 % and 5 % levels respectively

# **5** Conclusions

We have explored the market for paintings of Dutch and Flemish artists during the XVII century. In line with evolutionary theories of entry (Winter 1984) and theories of the industry life cycle (Jovanovic and Lach 1989; Klepper 1996) this market was initially characterized by a rapid entry pattern that was largely demand driven. The phase of increase in the number of painters was associated with the introduction of important product innovations, such as new genres and especially new styles that created what we now regard as the Golden Age of Dutch paintings. As typical of most mass markets, after rapid growth, the number of producers reached a peak and then started declining in a period characterized by strong competition, decreasing prices and new process innovations. We analyzed a rich dataset on the price of paintings and number of painters to test the claim that profitability was the main driver of entry of painters in this market. The econometric analysis appears to confirm that when the price of paintings was increasing there were new and more innovative painters who entered the market.

Further empirical investigations on our conjecture would be useful. In particular, the endogenous entry hypothesis on the economic source of artistic innovations could be tested through a preliminary channel that links exogenous shocks to price changes, which in turn determines endogenous processes of entry and innovation.<sup>46</sup> It would be also interesting to verify from art historical sources whether periods of increasing prices were associated with an increase in the number of apprentices and with more innovative artists,<sup>47</sup> whether painters tended to specialize in those genres that were in demand, and whether the timing of increasing specialization coincided with the entry of new artists.

At the end of the 1600s and at the beginning of the 1700s the Dutch market was in decline and the number of painters kept decreasing. Many artists moved to England, where a new booming market was emerging and would reach its golden age soon (see Bayer and Page 2011, and Etro and Stepanova 2017). Future research could explore similar evolutionary patterns in this and other historical periods or in other fields of creativity with econometric techniques.<sup>48</sup>

**Acknowledgments** We are grateful to Karol Jan Borowiecki, Roberto Casarin, Giovanni Dosi, Kathryn Graddy, Neil De Marchi, Bruno Frey, Alessandro Nuvolari and Paul Richard Sharp for comments and especially to Mario Padula for initial participation to the project and many invaluable suggestions. The paper was presented at the University of Southern Denmark in Odense and the Ca' Foscari University of Venice. Finally, Etro is thankful to Louisa Wood Ruby, Head of Photoarchive Research at the Frick Collection (New York).

<sup>&</sup>lt;sup>46</sup>In our case, this was not possible because the only available macroeconomic variable, the real wage, is not directly related to the price of paintings, since the latter should reflect asset pricing principles (it depends on the expected consumption dividend of holding a painting and, possibly, the resale price). The return on different assets would be the ideal tool for this analysis.

<sup>&</sup>lt;sup>47</sup>Anecdotal evidence suggests that a similar endogenous entry process could have been at work in other periods, such as the end of the 1700s and beginning of the 1800s Paris (Etro and Stepanova 2015) or in London (Etro and Stepanova 2017).

<sup>&</sup>lt;sup>48</sup>See for instance Borowiecki (2015) on the origins of cultural supply in Italy.

# References

- Bayer TM, Page JR (2011) The development of the art market in England: money as muse, 1730-1900. Pickering & Chatto Publishers
- Borowiecki KJ (2015) Historical origins of cultural supply in Italy. Oxford Econ Papers 67(3):781-805
- Box GEP, Jenkins GM (1970) Time series analysis: forecasting and control. Holden Day, San Francisco
- Chanel O, Gérard-Varet L-A, Ginsburgh V (1994) Prices and returns on paintings: an exercise on how to price the priceless. Geneva Papers Risk Insur Theory 19(1):7–21
- Chong A (1987) The market for landscape painting in seventeenth-century Holland. In: Sutton P (ed) Masters of the 17th-Century Dutch landscape painting. Exh. Cat., Boston, pp 104–20
- Crenshaw P (2006) Rembrandt's bankruptcy: the artist, his patrons, and the art world in seventeeth-century Netherlands. Cambridge University Press, Cambridge
- De Marchi N, Van Miegroet H (1994) Art, value, and market practices in the Netherlands in the seventeenth century. Art Bull 76(3):451–64
- De Marchi N, Van Miegroet H (eds) (2006) The history of art markets , Ch. 3. In Ginsburgh V, and Throsby D (eds) Handbook of the economics of art and culture, vol 1, Elsevier
- De Vries J (1982) An Inquiry into the behavior of wages in the Dutch Republican and the Southern Netherlands from 1580 to 1800. In: Aymard M (ed) Dutch capitalism and World capitalism. Cambridge University Press, Cambridge
- De Vries J, van der Woude A (1997) The first modern economy: success, failure, and perseverance of the Dutch economy, 1500-1815. Cambridge University Press
- Dosi G (1982) Technological paradigms and technological trajectories: a suggested interpretation of the determinants and directions of technical change. Res Polic 11(3):147–62
- Engle RF, Granger CWJ (1987) Cointegration and error correction: representation, estimation and testing. Econometrica 55:251–76
- Etro F., Colciago A. (2010) Endogenous market structures and the business cycle. Econ J 120:1201-34
- Etro F., Marchesi S., Pagani L. (2015) The labor market in the art sector of Baroque Rome. Economic Inquiry 53(1):365–87
- Etro F., Pagani L. (2012) The market for paintings in Italy during the seventeenth century. J Econ Hist 72(2):423–47
- Etro F, Pagani L (2013) The market for paintings in the venetian republic from renaissance to Rococo. J Cultur Econ 37(4):391–415
- Etro F, Stepanova E (2013) The market for paintings in the Netherlands during the Seventeenth Century, University of Venice, Ca' Foscari, Dept. of Economics W.P. 16
- Etro F, Stepanova E (2015) The market for paintings in Paris between Rococo and romanticism. Kyklos 68(1):28–50
- Etro F, Stepanova E (2016) Art collections and taste in the Spanish Siglo de Oro. J Cultur Econ. in press
- Etro F, Stepanova E (2017) Art auctions in London at the time of the industrial revolution, mimeo, Venice Gort M, Klepper S (1982) Time paths in the diffusion of product innovations. Econ J 92:630–53
- Granger CWJ (1969) Investigating causal relations by econometric models and cross-spectral methods. Econometrica 37(3):424–38
- Hauser A (1951) The social history of art. Routledge, London
- Jovanovic B, Lach S (1989) Entry, exit, and diffusion with learning by doing. Amer Econ Rev 79(4):690– 99
- Kemp M (1990) The science of art: optical themes in western art from Brunelleschi to Seurat. Yale University Press, New Haven
- Klepper S (1996) Entry, exit, growth, and innovation over the product life cycle. Amer Econ Rev:562–83 Klepper S (1997) Industry life cycles. Ind Corpor Change 6:145–82
- Klepper S (2002) Firm survival and the evolution of oligopoly. RAND J Econ 33(1):37–61
- Klepper S, Graddy E (1990) The evolution of new industries and the determinants of market structure. RAND J Econ 21(1):27–44
- Loughman J, Montias JM (2001) Public and private spaces. Works of art in seventeenth-century Dutch houses. Antique Collectors Club Ltd
- McCloskey D (2015) It was ideas and ideologies, not interests or institutions, which changed in Northwestern Europe, 1600–1848. J Evol Econ 25(1):57–68
- vanMander K (1604) Het Leven der Doorluchtighe Nederlandtsche, en Hooghduytsche Schilders, Haarlem

- Martens M, Peeters N (2006) Paintings in Antwerp Houses (1532-1567), Chapter 2 in De Marchi, N and H Van Miegroet Mapping markets for paintings in Europe 1450-1750. Brepols
- Montias JM (1982) Artists and artisans in Delft: a socio-economic study of the seventeenth century. Princeton
- Montias JM (1987) Cost and value in seventeenth-century art. Art Hist 10(4):455-66
- Montias JM, De Vries J (1991) Works of art in seventeenth-century Amsterdam: an analysis of sub-jects and attributions. In: Freedberg D (ed) Art in history/ history in art: studies in seventeenth-century Dutch culture, Santa Monica, pp 331–72
- Montias JM (1996) Quantitative methods in the analysis of 17th century Dutch inventories. In: Ginsburgh V, Menger P (eds) Economics of arts selected essays, Elsevier
- Montias JM (2002) Art at auction in 17th century Amsterdam. Amsterdam University Press, Amsterdam Nelson R, Winter SG (1982) An evolutionary theory of economic change. Harvard University Press
- North M (1999) Art and commerce in the Dutch golden age. Yale University Press, New Haven
- Ogilvie S (2004) Guilds, efficiency, and social capital: evidence from German Proto-industry. Econ Hist Rev 57(2):286–333
- Prak MR (2008) Painters, guilds and the art market during the Dutch Golden Age. In: Prak M, Epstein SR (eds) Guilds, innovation and the European economy 1400-1800. Cambridge University Press, Cambridge
- Rasterhoff C (2012) The fabric of creativity in the Dutch Republic. Painting and publishing as cultural industries, 1580-1800, PhD Dissertation, Utrecht
- Schama S (1987) The embarrassment of riches: an interpretation of Dutch culture in the Golden Age. Alfred A. Knopf, New York
- Schama S (1999) Rembrandt's eyes. Alfred A. Knopf, New York
- Scherer FM (2004) Quarter notes and bank notes: the economics of music composition in the 18th and 19th centuries. Princeton University Press, Princeton
- Sims CA, Stock JH, Watson MW (1990) Inference in linear time series models with some unit roots. Econometrica 58:133–44
- Slive S (1995) Dutch painting 1600-1800. Yale University Press, New Haven
- Sluijter EJ (2008) Determining value on the art market in the Golden Age: an introduction. In: Tummers A (ed) Art market and connoisseurship: a closer look at paintings by Rembrandt, Rubens and their contemporaries, pp 7–28
- Spear R, Sohm P (2010) Painting for profit. The economic lives of seventeenth-century Italian painters. Yale University Press, New Haven
- Toda HY, Yamamoto T (1995) Statistical inference in vector autoregressions with possibly integrated processes. J Economet 66(1–2):225–50
- Winter SG (1984) Schumpeterian competition in alternative technological regimes. J Econ Behav Organiz 5(3):287–320