# Clans, Guilds, and Markets: Apprenticeship Institutions and Growth in the Pre-Industrial Economy\*

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#### **Abstract**

In the centuries leading up to the Industrial Revolution, Western Europe gradually pulled ahead of other world regions in terms of technological creativity, population growth, and income per capita. We argue that superior institutions for the creation and dissemination of productive knowledge help explain the European advantage. We build a model of technological progress in a pre-industrial economy that emphasizes the person-to-person transmission of tacit knowledge. The young learn as apprentices from the old. Institutions such as the family, the clan, the guild, and the market organize who learns from whom. We argue that medieval European institutions such as guilds, and specific features such as journeymanship, can explain the rise of Europe relative to regions that relied on the transmission of knowledge within closed kinship systems (extended families or clans).

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#### 1 Introduction

The intergenerational transmission of skills and more generally of "knowledge how" has been central to the functioning of all economies since the emergence of agriculture. Historically, this knowledge was almost entirely "tacit" knowledge, in the standard sense used today in the economics of knowledge literature (Cowan and Foray, 1997; Foray, 2004, pp. 71–73, 96–98). Although economic historians have long recognized its the importance for the functioning of the economy (Dunlop, 1911, 1912), it is only more recently that tacit knowledge has been explicitly connected with the literature on human capital and its role in the Industrial Revolution and the emergence of modern economic growth (Humphries, 2003, 2010; Kelly, Mokyr, and Ó Gráda, 2014). The main mechanism through which tacit skills were transmitted across individuals was apprenticeship, a relation linking a skilled adult to a youngster whom he taught the trade. The literature on the economics of apprenticeship has focused on a number of topics we shall discuss in some detail below. Yet little has been done to analyze apprenticeship as a global phenomenon, organized in different modes.

In this paper, we examine the role of apprenticeship institutions in explaining economic growth in the pre-industrial era. We build a model of technological progress that emphasizes the person-to-person transmission of tacit knowledge from the old to the young (as in Lucas 2009 and Lucas and Moll 2014). Doing so allows us to go beyond the simplified representations of technological progress used in existing models of pre-industrial growth, such as Galor (2011). In our setup, a key part is played by institutions—the family, the clan, the guild, and the market—that organize who learns from whom. We argue that the archetypes of modes of apprenticeship that we consider in the model, while abstract, can be mapped into actual institutions that were prevalent throughout history in different world regions.

We use the theory to address a central question about pre-industrial growth, namely why Western Europe surpassed other regions in technological progress and growth in the centuries leading up to industrialization. What is at stake here is that while on the whole medieval Europe was not more advanced than China, India, or the Middle East, at some point before 1700 the seeds of Europe's primacy were planted, even if they were not to come to full fruition until the Industrial Revolution after 1750. These seeds were of many kinds, and here we will concentrate on one kind only, namely artisanal skills. In particular, we claim that late medieval and early modern European institutions such as guilds, with specific regulatory features such as apprenticeship and journeymanship,

were critical in speeding up the dissemination of new productive knowledge in Europe, compared to regions that relied on the transmission of knowledge within extended families or clans.<sup>1</sup> After 1500, many decades before the Industrial Revolution, we can readily observe major advances in European craft production in products as diverse as shipbuilding, textiles, lensgrinding, metalworking, printing, mining, clockmaking, millwrighting, carpentry, ceramics, painting, and so on. Before 1700, few if any of those improvements had much to do with formal codified knowledge—they derived first and foremost from improved artisanal skills—which historians have called "mindful hands" (Roberts and Schaffer 2007) that disseminated rapidly.

Before developing a theory of the modes of institutional organization of apprenticeship and their implications for knowledge dissemination, we address three key issues one should address in modeling. First, the main issue is the extent to which the mode of organizing the transmission of skills was consistent with technological progress. We take the view from the outset that all systems of apprenticeship are consistent with at least some degree of progress. Even when the system has strong conservative elements that administer rigid tests on the existing procedures and techniques, learning by doing generates a certain cumulative drift over time that can raise productivity, even in the most conservative systems. That said, the rates at which innovation occurred within artisanal systems have differed dramatically over time, over different societies and even between different products. Differences in rates of technological progress may in principle have two different sources, namely the rate of original innovation and the speed of the dissemination of existing ideas. While we discuss implications for original innovation, our theoretical analysis focuses on the second channel. Specifically, we ask how conducive the intergenerational transmission mechanism was to the dissemination of best-practice techniques, and how conducive an apprenticeship system based on personal contacts and mostly local networks was to closing gaps between best-practice and average-practice techniques.

Second, the training contract between master and apprentice (whether formal or implicit), for obvious reasons, represents a complicated transaction. For one thing, unless that transmission occurs within the nuclear family (in a father-son line), the person negotiating the transaction is not the subject of the contract himself but his parents, raising inevitable agency problems. Moreover, the contract written with the "master" by its very nature is largely incomplete. The details of what is to be taught, how well, how

<sup>&</sup>lt;sup>1</sup>Our emphasis on the role of clans in organizing economic life for comparative development is shared with Greif and Tabellini (2010), although the mechanisms considered are entirely different.

fast, what tools and materials the pupil would be allowed to use, as well as other aspects such as room and board, are impossible to specify fully in advance. Equally, apart from a flat fee that many apprentices paid upfront, the other services rendered by the apprentice, such as labor, were hard to enumerate. This was, in a word, an archetypical incomplete contract. As a consequence, in our theoretical analysis moral hazard in the master-apprentice relationship is the central element that creates a need for institutions to organize the transmission of knowledge.

Third, and as a result of the contractual problems in writing an apprenticeship agreement, a variety of institutional setups for supervising and arbitrating the apprenticemaster relations can be found in the past. In all cases except direct parent-child relationships, some kind of enforcement mechanism was required. Basically three types of institutions can be discerned that enforced contracts and, as a result, ended up regulating the industry in some form. They were (1) informal institutions, based on reputation and trust; (2) non-state semi-formal institutions (guilds, local authorities such as the Dutch *neringen*); and (3) third party (state) enforcement usually by local authorities and courts. In many places all three worked simultaneously and should be regarded as complements, but their relative importance varied quite a bit. In our theoretical analysis, we map the wide variety of historical institutions into four archetypes, namely the (nuclear) family, the clan (i.e., a trust-based institution comprising an extended family), the guild (a semi-formal institution), and the market (which comprises formal contract enforcement by a third party).

Our theoretical model builds on a recent literature in the theory of economic growth that puts the spotlight on the dissemination of knowledge through the interpersonal exchange of ideas.<sup>2</sup> Given our focus on pre-industrial growth, the analysis is carried out in a Malthusian setting with endogenous population growth in which the factors of production are the fixed factor land and the supply of effective labor by workers ("craftsmen") in a variety of trades. Knowledge is represented as the efficiency with which craftsmen perform tasks. While there is some scope for new innovation, the main engine of technological progress is the transmission of productive knowledge from old to young workers. Young workers learn from elders through a form of apprenticeship.

<sup>&</sup>lt;sup>2</sup>Specifically, the underlying engine of growth in our model is closely related to Lucas (2009), who in turn builds on earlier seminal contributions by Jovanovic and Rob (1989), Kortum (1997), and Eaton and Kortum (1999). Earlier explicit models of endogenous technological progress build on R&D efforts by firms, following the seminal papers of Romer (1990) and Aghion and Howitt (1992). While such models are useful for analyzing innovation in modern times, their applicability to pre-industrial growth is doubtful, partly because legal protections for intellectual property became widespread only recently.

There is a distribution of knowledge (or productivity) across workers, and when young workers learn from multiple old workers, they can adopt the best technique to which they have been exposed. Through this process, average productivity in the economy increases over time.<sup>3</sup>

The central features of our analysis are that the transmission of knowledge (teaching) requires effort on the part of the master; that this leads to a moral hazard problem in the master-apprentice relationship; and that, as a consequence, institutions that mitigate or eliminate the moral hazard problem are key determinants of the dissemination of knowledge and economic growth.<sup>4</sup>

The "family" in our analysis is the polar case where no enforcement mechanism is available that reaches beyond the nuclear family, and hence children learn only from their own parents. In the family equilibrium, there is still some technological progress due to experimentation with new ideas and innovation within the family, but there is no dissemination of knowledge, and hence the rate of technological progress is low. The "clan" is an extended family where reputation and trust provide an informal enforcement mechanism. Hence, children can become apprentices of members of the clan other than their own parent (such as uncles). The clan equilibrium leads to faster technological progress compared to the family equilibrium, because productive new ideas disseminate within each clan. The "guild" in our model is a coalition of all the masters in a given trade that provides a semi-formal enforcement mechanism, but also regulates (monopolizes) apprenticeship within the trade. Finally, the "market" is a formal enforcement institution where an outside authority (such as the state) enforces contracts, and in addition, rules are in place that prevent anticompetitive behavior (such limitations on the supply of apprenticeship imposed by guilds).

In terms of mapping the model into historical institutions, we regard most world regions (in particular China, India, and the Middle East) as being characterized by the clan equilibrium throughout the pre-industrial era. Here extended families organized

<sup>&</sup>lt;sup>3</sup>Recent growth models that build on a process of this kind (in addition to Lucas 2009) include Alvarez, Buera, and Lucas (2008, 2013), König, Lorenz, and Zilibotti (2016), Lucas and Moll (2014), Luttmer (2007, 2015), and Perla and Tonetti (2014). Among these papers, Luttmer (2015) also considers a market environment where students are matched to teachers, although without allowing for different institutions. Particularly relevant to our work is also Fogli and Veldkamp (2012), where the structure of a network has important ramifications for the rate of productivity growth. The research is also related to models of productivity growth over the very long run such as Kremer (1993) and Jones (2001).

<sup>&</sup>lt;sup>4</sup>Additional innovations relative to the recent literature on growth based on the exchange of ideas are that we examine endogenous institutional change, and that we allow for endogenous population growth.

most aspects of economic life, including the transmission of skills between generations. The distinctive features of Western Europe are a much larger role of the nuclear family from the first centuries of the Common Era; little significance of extended families; and an increasing relevance of institutions that do not rely on family ties (such as cities and indeed guilds) starting in the Middle Ages. Hence, in the language of the model, we view Western Europe as undergoing a transition from the family to the guild equilibrium during the Middle Ages, and onwards to the market equilibrium in the centuries leading up to the Industrial Revolution.

To explain the emerging primacy of Western Europe over other world regions, we look to the comparative growth performance of the clan and guild institutions. Both the clan and the guild provided for apprenticeship outside the nuclear family, and a count against the guild is the anticompetitive nature of guilds, i.e., the possibility that guilds limited access to apprenticeship to raise prices. However, our analysis identifies a much more important force that explains why the Western European system of knowledge acquisition came to dominate. Namely, apprenticeship within guilds was independent of family ties, and thus allowed for dissemination of knowledge in the entire economy, whereas in a clan based system the dissemination of knowledge was impaired. A different side of the same coin is that in a clan based system, relatively little is gained by learning from multiple elders, because given that these elders belong to the same clan, they are likely to have received the same training and thus to have very similar knowledge. In contrast, in a guild (and also in the market) family ties do not limit apprenticeship, and hence the young can sample from a much wider variety of knowledge, implying that apprenticeship is more productive and knowledge disseminates more quickly. The historical evidence shows that, indeed, in Europe master and apprentice were far less likely to be related to each other than elsewhere. Moreover, the guild system sometimes included specific features, in particular journeymanship, that had the effect of providing access to a broader range of knowledge and fostering the spread of new techniques and ideas. In a narrower system based on blood relationships, such a wide exchange of ideas was not feasible.

Our framework can also be used to explore why institutional change (i.e., the adoption of guilds and, later on, the market) took place in Europe, but not elsewhere. If adopting new institutions is costly, the incentive to adopt will be lower when the initial economic system is relatively more successful, i.e., in a clan-based economy compared to a family-based economy. If the cost of adopting new institutions declines with population den-

sity, it is possible that new institutions will only be adopted if the economy starts out in the family equilibrium, but not if the clan equilibrium is the initial condition. We also discuss complementary mechanisms (going beyond the formal model) that are likely to have contributed also to faster institutional change in Europe.

The paper engages three recent literatures in economic history that have received considerable attention. One is the debate over whether craft guilds were on balance a hindrance to technological progress, or whether they stimulated it by supporting apprenticeship relations (for a recent summary, see van Zanden and Prak, eds. 2013b and Ogilvie 2004). The second new literature is the one emphasizing the ingenuity of artisans and skilled workers in generating knowledge, and minimizing the classic distinction between formal science and practical knowledge. Roberts and Schaffer stress the importance of "local technological projects" carried out by the "tacit genius of on-thespot practitioners;" here they clearly refer to thoughtful and well-trained artisans who advance the frontiers of useful knowledge (Roberts and Schaffer, 2007; see also Long 2011). Little in this literature, however, has focused on the intergenerational transmission of the knowledge embedded in such "mindful hands" through the institutions of apprenticeship. The third literature is concerned with understanding economic, institutional, and cultural differences between Europe and other world regions as a source of the relative rise of Europe and decline of other regions in the centuries leading up to the Industrial Revolution (e.g., Broadberry 2015, Voigtländer and Voth 2013b, 2013a). We build in particular on the work by Greif and Tabellini (2017) on the role of clans in China versus "corporations" in Europe (i.e., formal organizations that exist independently of family ties) for sustaining cooperation (see also Greif 2006 and Greif, Iyigun, and Sasson 2012). However, Greif and Tabellini do not consider the implications of such institutions for the generation and dissemination of productive knowledge.

The paper is organized as follows. Section 2 describes key historical aspects of apprenticeship systems on which we base our theory. Our formal model of knowledge growth is described in Section 3. Section 4 analyzes the different apprenticeship institutions and derives their implications for economic growth. Section 5 quantifies the ability of the theory to account for the rise of European technological primacy, and considers endogenous adoption of institutions. Section 6 concludes.

# 2 Historical Background

## 2.1 Learning on the Shopfloor

Through most of history, the acquisition of human capital took the form, in the felicitous phrase of De Munck and Soly (2007), of "learning on the shopfloor." One should not take this too literally: some skills had to be learned on board of ships or on the bottom of coal mines. Yet it remains true that learning took place through personal contact between a designated "master" and his apprentice.<sup>5</sup> As they point out (ibid., p. 6), before the middle of the nineteenth century there were few alternatives to acquiring useful productive skills. Some of the better schools, such as Britain's dissenting academies or the drawing schools that emerged on the European continent around 1600, taught, in addition to the three Rs, some useful skills such as draftmanship, chemistry, and geography. But on the whole, the one-on-one learning process was the one experienced by most.<sup>6</sup>

The economics of apprenticeship in the premodern world is based on the insight that each master artisan basically produced a set of two connected outputs: a commodity or service, and new craftsmen. In other words, he sold "human capital." The economics of such a setup explains many of the historical features of the system. The best-known, of course, is that the apprentice had to supply labor services to the master in partial payment for his training and his room and board. In some instances, this component became so large that the apprentice contract was more of a labor contract than a training arrangement. Such provisions underline the basic idea of joint production, in which the two activities—production and training—were strongly complementary.

As Humphries (2003) has pointed out, the contract between the master and the apprentice in any institutional setting is problematic in two ways. First, the flows of the services transacted for is non-synchronic (although the exact timing differed from occupation to occupation). Second, these flows cannot be fully specified ex ante or observed ex post. The apprentice, by the very nature of the teaching process, is not in a position to assess

<sup>&</sup>lt;sup>5</sup>We consider an era which is characterized by a sharp division of labor by gender, and where formal apprenticeship generally was open only to boys. Hence, we will refer to master and apprentice as "he" throughout the paper, and our model does not distinguish two genders.

<sup>&</sup>lt;sup>6</sup>Of course, printed material became increasingly widespread after Gutenberg, but played a limited role in the training of craftsmen. The printing press was relatively more important for providing access to science and and similar "top end" knowledge; see Dittmar (2011) for an analysis of the overall impact of printing on early economic growth.

<sup>&</sup>lt;sup>7</sup>Steffens (2001), pp. 124–25, observes on the basis of nineteenth century Belgian apprentices that little explicit teaching was carried out and that the learning was simply occurring through the performance of tasks.

adequately whether he has received what he has paid for until the contract is terminated. Even if the apprentice himself could observe the implementation of the contract, the details would be unverifiable for third parties and adjudicators. Because the transaction is non-repeated, the party who receives the services or payment first has an incentive to shirk. This is known ex ante, and therefore it is possible that the transaction does not take place and that the economy would suffer from the serious underproduction of training.<sup>8</sup> However, since that would mean that intergenerational transmission of knowledge would take place exclusively within families, some societies have come up with institutions that allowed the contracts to be enforced between unrelated parties. These institutions curbed opportunistic behavior in different ways, but they all required some kind of credible punishment. As we will see in our theoretical analysis below, the more sophisticated and effective institutions led to better quality of training (in a precise matter we will define) and thus led to faster technological progress.

#### 2.2 Apprenticeship in Western Europe

The evidence suggests that at least in early modern Europe the market for apprenticeship functioned reasonably well, despite the obvious dangers of market failure. A good indicator of the working of the market for human capital, at least in Britain, was the premium that parents paid to a master. Occupations that demanded more skill and promised higher lifetime earnings commanded higher premiums. The differences in premiums meant that this market worked, in the sense that the apprenticeship premium seems to have varied positively with the expected profitability and prestige of the chosen occupation (Brooks 1994, p. 60). As noted by Minns and Wallis (2013), the premium paid was not a full payment equal to the present value of the training plus room and board, which usually were much higher than the upfront premium. The rest normally was paid in kind with the labor provided by the apprentice. The premium served more than one purpose. In part, it was to insure the master against the risk of an early departure of the apprentice. But in part it reflected also the quality of the training and the cost to the master, as well as its scarcity value (ibid., p. 340). More recently, it has been shown that the premium worked as a market price reflecting rising and falling demand for certain occupations resulting from technological shocks (Ben Zeev, Mokyr, and Van

<sup>&</sup>lt;sup>8</sup>The suggestion by Epstein (2008, p. 61) that the contract could be rewritten to prevent either side from defaulting is not persuasive. For instance, he suggests that by backloading some of the payments from master to apprentice, the latter would be deterred from defecting early—but that of course just shifts the opportunity to cheat from the apprentice to the master.

Der Beek 2017). It is telling that not all apprentices paid the premiums: whereas 74 percent of engravers in London paid a premium in London, only 17 percent of blacksmiths did (Minns and Wallis, 2013, p. 344). If an impecunious apprentice could not pay, he had the option of committing to a longer indenture, as was the case in seventeenth century Vienna (Steidl, 2007, p. 143). In eighteenth century Augsburg a telling example is that a "big strong man was often taken on without having to pay any apprenticeship premium, whereas a small weak man would have to pay more." It is also recorded that apprentices with poor parents who could not afford the premium would end up being trained by a master who did inferior work (Reith, 2007, p.183). This market worked in sophisticated ways, and it is clear is that human capital was recognized to be a valuable commodity. The formal contract signed by the apprentice in the seventeenth century included a commitment to protect the master's secrets and not to abscond, as well as to not commit fornication (Smith, 1973, p. 150).

The precise operation of apprenticeship varied a great deal. The duration of the contract depended above all on the complexity of the trade to be learned, but also on the age at which youngsters started their apprenticeship. On the continent three to four years seems to have been the norm (De Munck and Soly, 2007, p. 18). As would perhaps be expected, there is evidence that the duration of contracts grew over the centuries as techniques became more complex and the division of labor more specialized as a result of technological progress (Reith 2007, p. 183).

To what extent was the master-apprentice contract actually enforced? Historians have found that often contracts were not completed (De Munck and Soly, 2007 p. 10). Wallis (2008, pp. 839-40) has shown that in late seventeenth century London a substantial number of apprentices left their original master before completing the seven mandated years of their apprenticeship. The main reason was that the rigid seven year duration stipulated by the 1562 Statute of Artificers (which regulated apprenticeship) was rarely enforced, as were most other stipulations contained in that law (Dunlop, 1911, 1912). As Wallis (2008, p. 854) remarks, "like many other areas of premodern regulation, the tidy hierarchy of the seven-year apprenticeship leading to mastery was more ideal than reality." Rather than an indication of contractual failure, the large number of apprentices that did not "complete" their terms indicates a greater flexibility in Britain. The number of lawsuits filed against such apprentices was not large (Rushton 1991, p. 94),

<sup>&</sup>lt;sup>9</sup>For a more nuanced view, see Davies 1956, who argues that enforcement was a function of the economic circumstances, but agrees that there is little evidence of apprentices being sued or denied the right to exercise their occupation for having served fewer than seven years.

and London court records indicate that apprentices wishing to be released from their masters could do so fairly easily in the Lord Mayor's Court (Wallis 2012). Wallis notes that about 5 percent of all indentures ended up in this court (p. 816). It seems that many of the early departures were by mutual consent (see also Wallis 2008, p. 844). To protect themselves against an early departure, many masters in England demanded and received a lump-sum upfront tuition payment from the parents or guardian of the youngster (Minns and Wallis 2013; Ben Zeev, Mokyr, and Van Der Beek 2017).

The flexibility of the contracts in pre-industrial England limited the risk each contracting party faced from the opportunistic behavior of the other. This institution, then, would be more successful in terms of transmitting existing skills between generations in an efficient manner. Once an apprentice had mastered a skill, there would be little point in staying on. Moreover, in many documented cases apprentices were "turned over" to another master—by some calculation this was true of 22 percent of all apprentices who did not complete their term (Wallis, 2008, pp. 842-43). There could be many reasons for this, of course, including the master falling sick or being otherwise indisposed. But also, at least some apprentices might have found that their master did not teach them best practice techniques or that the trade they were learning was not as remunerative as some other.

The exact mechanics of the skill transmission process are hard to nail down. After all, the knowledge being taught was tacit, and mostly consisted of imitation and learning-by-doing. It surely differed a great deal from occupation to occupation. Moreover, our own knowledge is biased to some extent by the better availability of more recent sources. All the same, Steffens (2001) has suggested that much of the learning occurred through apprentices "stealing with their eyes" (p. 131) – meaning that they learned mostly through observation, imitation, and experimentation. The tasks to which apprentices were put at first, insofar that they can be documented at all, seem to have consisted of rather menial assignments such as making deliveries, cleaning and guarding the shop. Only at a later stage would an apprentice be trusted with more sensitive tasks involving valued customers and expensive raw materials (Lane, 1996, p. 77). Yet they spent most of their waking hours in the presence of the master and possibly more experienced apprentices and journeymen, and as they aged they gradually would be trusted with more advanced tasks.<sup>10</sup>

<sup>&</sup>lt;sup>10</sup>Wallis (2008, p. 849) compares the process with what happens in more modern days amongst minaret builder apprentices in Yemen: "instruction is implicit and fragmented, questions are rarely posed, and reprimands rather than corrections form the majority of feedback." De Munck makes a similar point

One of the most interesting findings of the new research on apprenticeship, which is central to the theory developed below, is that in Europe family ties were relatively less important than elsewhere in the world, such as India (Roy, 2013, pp. 71, 77). In China, guilds existed, 11 but were organized along clan lines and it is within those boundaries that apprenticeship took place (Moll-Murata, 2013, p. 234). In contrast, Europeans came to organize themselves along professional lines without the dependence on kinship (Lucassen, de Moor, and van Zanden, 2008, p. 16). Comparing China and Europe, van Zanden and Prak (2013a) write: "In China, training was provided by relatives, and hence a narrow group of experts, instead of the much wider training opportunities provided by many European guilds." The contrast between Asia and Europe in systems of knowledge transmission is also emphasized by van Zanden (2009): "We can distinguish two different ways to organize such training: in large parts of the world the family or the clan played a central role, and skills were transferred from fathers to sons or other members of the (extended) family. In fact, in parts of Asia, being a craftsman was largely hereditary ... In contrast to the relatively closed systems in which the family played a central role, Western Europe had a formal system of apprenticeship organized by guilds or similar institutions—and in principle open to all." In China, young men were specifically selected and ordered by their families to apprentice with another lineage member. Such apprenticeship relations were routinely formed across patrilines and even branches (Rowe, 1990, p. 75). In Western Europe, despite the fact

when he writes that "masters were merely expected to point out what had gone wrong and what might be improved" (cited in De Munck and Soly 2007, p. 16 and p. 79).

 $<sup>^{11}</sup>$ The transition away from a kinship-based training system occurred in China much later and slower than in Europe. The clan-based economy worked well for China, and there was little need for reform until European progress began to be a threat. Yet the differences were of degree, not of essence. The existence of some guilds in China from the late Ming period on is established fact, and by the late nineteenth century they had become quite powerful and operated as rent-seeking cartels (Brown 1979). Much more than in Europe, however, these guilds were based on common ancestry. There is some evidence that they may have made provisions about apprenticeship, though formal evidence of that is lacking before the twentieth century (Morse 1909, pp. 31-34; Moll-Murata 2013, p. 234). There is no evidence, however, that these guilds did much to enforce the contract between master and apprentice. Guild regulations often restricted the number of apprentices that a master could take (as a measure to restrict entry, no doubt). In some cases guilds specifically postulated that only family members could learn the trade (Morse 1909, p. 33). However, it is clear that, in contrast with Europe, the ancient tradition of a close association between kinship (common origin) and training remained intact (Macgowan, 1888-89, p. 181). In twentieth century southern China it was reported that "not only were the elders of the town the heads of the clan but the entire industry was organized and monopolized by the clan" (Burgess 1928, p. 71). Even in modern China, "crucial skills are often kept within the family. The craftsman-owner and other experienced craftsmen intentionally inhibit the acquisition of knowledge by new workers who are not biologically related" (Zhu, Chen, and Dai, 2016, see also Gowlland, 2012). The practice of training within kinship units was especially prevalent in high-skilled crafts such as medicine (Islam 2016).

that within the guilds the sons of masters received preferential treatment and that training with a relative resolved to a large extent the contractual problems, following in the footsteps of the parents gradually fell out of favor (Epstein and Prak 2008, p. 10). The examples of Johann Sebastian Bach and Leopold Mozart notwithstanding, fewer and fewer boys were trained by their fathers. By the seventeenth century, apprentices who were trained by relatives were a distinct minority, estimated in London to be somewhere between 7 and 28 percent (Leunig, Minns, and Wallis 2011, p. 42). Prak (2013, p. 153) has calculated that in the bricklaying industry, fewer than ten percent continued their fathers' trades. This may have been a decisive factor in the evolution of apprenticeship as a market phenomenon in Europe, but not elsewhere.<sup>12</sup>

## 2.3 Mobility and the Diffusion of Knowledge

In premodern Europe, as early as fifteenth century Flanders, artisans were mobile. In England, such mobility was particularly pronounced (Leunig, Minns, and Wallis 2011), with lads from all over Britain seeking to apprentice in London, not least of all the young James Watt and Joseph Whitworth, two heroes of the Industrial Revolution. But as Stabel (2007, p. 159) notes, towns and their guilds had to accept and acknowledge skills acquired elsewhere, even if they insisted that newcomers adapt to local economic standards set by the guilds. Constraints were more pronounced on the continent, but even here apprentices came to urban centers from smaller towns or rural regions (De Munck and Soly, 2007, p. 17), and mobility of artisans and the skills they carried with them extended to all of Europe.

The idea of the "journeyman" or "traveling companion" was that after completing their training, new artisans would travel to another city to acquire additional skills before they would qualify as masters—much like postdoctoral students today (Lis, Soly, and Mitzman 1994, Leeson 1979). As such, journeymanship was traditionally the "intermediate stage" between completing an apprenticeship and starting off as a fullfledged master. Journeymen and apprentices are known to have traveled extensively as early as the fourteenth century, often on a seasonal basis, a practice known as "tramping." By the early modern period, this practice was fully institutionalized in Central Europe (Epstein, 2013, p. 59). Itinerant journeymen, Epstein argues, learned a variety of techniques practiced in different regions and were instrumental in spreading best-practice

<sup>&</sup>lt;sup>12</sup>The cases of Japan and the Ottoman Empire are less clear cut; guilds clearly played some role here (see Nagata 2007, 2008, Yildirim 2008), but less is known about their role for organizing apprenticeship and the importance of family ties in the selection of apprentices.

techniques. Towns that believed to enjoy technological superiority forbade the practice of tramping and made apprentices swear not to practice their trades anywhere else, as with Nuremberg metal workers and Venetian glassmakers (ibid., pp. 60-61). Such prohibitions were ineffective at best and counterproductive at worst.

Not every apprentice had to go through journeymanship, and relatively little is known about how long it lasted and how it was contracted for. Journeymen have been regarded by much of the literature as employees of masters, and were often organized in compagnonnages which frequently clashed with employers. Journeymen in many cases were highly skilled workers, but more mobile than masters. Known as "travellers" or "tramps," they often chose to bypass the formal status of master but prided themselves on their skills, considering themselves "equal partners" to masters (Lis, Soly, and Mitzman 1994, p. 19). In Elizabethan England, the "number of surplus though fully apprenticed men forced to take the road clearly grew ... the custom of quizzing, registering and entertaining the stranger became more regularized" (Leeson 1979, p. 56). The letter of the 1562 Statute of Artificers was clearly intended to curtain mobility, but in practice these aspects of the Statute were widely disregarded (ibid., pp. 63-65). The mobility of journeymen lent itself to the creation of networks in the same lines of work, and it stands to reason that technical information flowed fairly freely along those channels of communication. Journeymen are relevant to our story for two reasons: first, because when working in a shop different from the one they were trained in, they were exposed to other skills after they completed their apprenticeship; and second, because the apprentices in the workshops in which they worked after completing their training could learn from them (and thus indirectly from the journeymen's masters) in addition to their own masters (e.g., Unger 2013, p. 186). In this way they were an important component of how the European system of apprenticeship allowed learning from more than just one source. But skilled masters, too, traveled across Europe, often deliberately attracted by mercantilist states or local governments keen to promote their manufacturing industries through the recruitment of high-quality artisans. Technology diffusion occurred largely through the migration of skilled workers, or through apprentices traveling to learn from the most renowned masters (and then returning home). Interestingly, such migration seems to have focused mostly on towns in which the industry already existed and which were ready to upgrade their production techniques (Belfanti 2004, p. 581).

#### 2.4 Apprenticeship and Guilds

In medieval and early modern Europe, where in most areas third-party enforcement of contracts was still quite weak, the guilds played a crucial role in making apprenticeship relations effective. As late as the eighteenth century, for French bakers, "the guild made the rules for apprenticeship and mediated relations between masters and apprentices ... it sought to impose a common discipline and code of conduct on masters as well as apprentices to ensure good order" (Kaplan 1996, p. 199). Where third party enforcement was stronger, or where apprenticeship contracts could be enforced through informal institutions, this role of the guilds became less essential, and consequently market equilibria became more common.

There has been a lively debate in the past two decades about the role of the guilds in premodern European economies. Traditionally relegated by an earlier literature to be a set of conservative, rent-seeking clubs, a revisionist literature has tried to rehabilitate craft guilds as agents of progress and technological innovation. Part of that storyline has been that guilds were instrumental in the smooth functioning of apprenticeships. As noted, given the potential for market failure due to incomplete contracts, incentive incompatibility, and poor information, agreements on intergenerational transmission of skills needed enforcement, regulation, and supervision. In a setting of weak political systems, the guilds stepped in and created a governance system that was functional and productive (Epstein and Prak 2008; Lucassen, de Moor, and van Zanden 2008; van Zanden and Prak 2013b). In a posthumously published essay, Epstein stated that the details of the apprenticeship contract had to be enforced through the craft guilds, which "overcame the externalities in human capital formation" by punishing both masters and apprentices who violated their contracts (Epstein 2013, pp. 31-32). The argument has been criticized by Ogilvie (2014, 2016). Others, too, have found cases in which the nexus between guilds and apprenticeships proposed by Epstein and his followers does not quite hold up (Davids, 2003, 2007).

The reality is that some studies support Epstein's view to some extent, and others do not. The heated polemics have made the more committed advocates of both positions state their arguments in more extreme terms than they can defend. Guilds were institutions that existed through many centuries, in hundreds of towns, and for many occupations. This three-dimensional matrix had a huge number of elements, and it stands to reason that things differed over time, place, and occupation.

Most scholars find themselves somewhere in between. Guilds were at times hostile to innovation, especially in the seventeenth and eighteenth centuries, and under the pretext of protecting quality they collected exclusionary rents by longer apprenticeships and limited membership. But in some cases, such as the Venetian glass and silk industries, guilds encouraged innovation (Belfanti 2004, p. 576). Their attitude to training, similarly, differed a great deal over space and time. Davids (2013, p. 217), for instance, finds that in the Netherlands "guilds normally did not intervene in the conditions, registration, or supervision of [apprenticeship] contracts." Unger (2013, p. 203), after a meticulous survey, must conclude that the "precise role of guilds in the long term evolution of shipbuilding technology remains unclear." Moll-Murata (2013, p. 256), in comparing the porcelain industries in the Netherlands and China, retreats to a position that "contrasting the guild rehabilitationist [Epstein's] and the guild-critical positions is difficult to defend ... we find arguments supporting both propositions."

Guilds and apprenticeship overlapped, but they did not strictly require each other, especially not after 1600. Apprenticeship contracts could find alternative enforcement mechanisms to guilds. In the Netherlands local organizations named neringen were established by local government to regulate and supervise certain industries independently of the guilds. They set many of the terms of the apprenticeship contract, often the length of contract and other details (Davids, 2007, p. 71). Even more strikingly, in Britain, most guilds gradually declined after 1600 and exercised little control over training procedures (Berlin, 2008). Moreover, informal institutions and reputation mechanisms in many places helped make apprenticeship work even in the absence of guilds. As Humphries (2003) argues, apprenticeship contracts in England may have been, to a large extent, selfenforcing in that opportunistic behavior in fairly well-integrated local societies would be punished severely by an erosion of reputation. Market relationships were linked to social relationships, and such linkages are a strong incentive toward cooperative behavior (Spagnolo 1999). For example, a master found to treat apprentices badly might not only lose future apprentices, but also damage relations with his customers and suppliers. The same was true for the apprentices, whose future careers would be damaged if they were known to have reneged on contracts. If both master and apprentice expected this in advance, in equilibrium they would not engage in opportunistic behavior and would try to make their relationship as harmonious as possible.<sup>13</sup> The limits to such self-enforcing contracts are obvious. Mobility of apprentices after training would mean

<sup>&</sup>lt;sup>13</sup>The reputation and trust that sustained market equilibria depended to some extent on some level of third party enforcement, in that contracts were signed in "the shadow of the law" in which both parties

that the reach of reputation was limited, and in larger communities the reputation mechanism would be ineffective. Substantial opportunistic behavior could cause the cooperative equilibrium to unravel.

All the same, it has been stressed that despite the convincing evidence that guilds in some cases helped in the formation of human capital and supported innovation, the two economies in which technological progress was the fastest after 1600 were the Netherlands and Britain, the two countries in which guilds were relatively weak (Ogilvie, 2016). That such a correlation does not establish causation goes without saying, but it does serve to warn us against embracing the revisionist view of guilds too rashly.

In the theory articulated below, the growth implications of the guild system can be assessed according to their next best alternative. If the state is sufficiently strong to enforce contracts and enable apprenticeship without guilds being involved, the anticompetitive aspect of guilds dominates, and thus guilds hinder growth (consistent with faster growth in the Netherlands and Britain after 1600, when the state increasingly took over functions once served by guilds and cities). But when the state is weak, and the choice is between apprenticeship provided via guilds or via clans, the faster dissemination of knowledge associated with guilds dominates. We now turn to the theory that spells out these results in a formal model of knowledge transmission.

# 3 A Model of Pre-Industrial Knowledge Growth

In this section, we develop an explicit model of knowledge creation and transmission in a pre-industrial setting. By pre-industrial, we mean that aggregate production relies on a land-based technology that exhibits decreasing returns to the size of the population. In addition, there is a positive feedback from income per capita to population growth, implying that the economy is subject to Malthusian constraints. We do not mean to imply a commitment to a fundamentalist "iron wage" version of this model in which all gains from productivity growth are relentlessly translated into population growth; the assumption is made only for modeling convenience. Compared to existing Malthusian models, the main novelty here is that we explicitly model the transmission of knowledge from generation to generation and the resulting technological progress. This allows us to

knew that in the last resort both could turn to the courts as a grim strategy, and hence it sustained voluntary cooperation. In such a world the surviving documents (most of them from court records) would reflect off the equilibrium path behavior, and thus be biased in not reflecting the basic effectiveness of the system.

to analyze how institutions affect the transmission of knowledge, and how this interacts with the usual forces present in a Malthusian economy.

#### 3.1 Preferences, Production, and the Productivity of Craftsmen

The model economy is populated by overlapping generations of people who live two periods, childhood and adulthood. All decisions are made by adults, whose preferences are given by the utility function:

$$u(c, I') = c + \gamma I', \tag{1}$$

where c is the adult's consumption and I' is the total future labor income of this adult's children. The parameter  $\gamma > 0$  captures altruism towards children. The role of altruism is to motivate parents' investment in their children's knowledge.

The adults work as craftsmen in a variety of trades. At the beginning of a period, the aggregate economy is characterized by two state variables: the number of craftsmen N, and the amount of knowledge k in the economy. Craftsmen are heterogeneous in productivity, and knowledge k determines the average productivity of craftsmen in a way that we make precise below. We start by describing how aggregate output in our economy depends on the state variables N and k.

The single consumption good (which we interpret as a composite of food and manufactured goods) is produced with a Cobb-Douglas production function with constant return to scale that uses land *X* and effective craftsmen's labor *L* as inputs:

$$Y = L^{1-\alpha} X^{\alpha}, \tag{2}$$

with  $\alpha \in (0,1)$ . The total amount of land is normalized to one, X=1. Land is owned by craftsmen. At first sight, including land (and hence allowing for decreasing returns) in the technology may appear surprising, because land is usually not an important inputs for artisans and craftsmen. However, land is still a scarce factor because raw materials used in manufacturing such as wool, leather, timber, grains, grapes, and bricks had a substantial land component. Alternatively, we would get similar results in an economy

<sup>&</sup>lt;sup>14</sup>Our main results would be identical if a separate class of landowners were introduced. The model abstracts from an explicit farming sector; however, it would be straightforward to include farm labor as an additional factor of production (see Appendix A), or alternatively we can interpret some of the adults who we refer to as craftsmen as farmers.

where there are constant returns for the craftsmen's technology, but people also consume food, which is subject to the land constraint. In such a setting, aggregate decreasing returns would be reflected in a gradually declining relative price of manufactured output along a balanced growth path.<sup>15</sup>

The effective labor supply by craftsmen L is a CES aggregate of effective labor supplied in different trades j:

$$L = \left(\int_0^1 (L_j)^{\frac{1}{\lambda}} dj\right)^{\lambda},\tag{3}$$

with  $\lambda > 1$ . The elasticity of substitution between the different trades is  $\lambda/(\lambda-1)$ . The distinction among different trades of craftsmen (watchmaker, wheelwright, blacksmith etc.) is important for our analysis of guilds below, which we model as coalitions of the craftsmen in a given trade. However, the equilibrium supply of effective labor will turn out to be the same in all trades, so that  $L_j = L$  for all j. For most of our analysis, we can therefore suppress the distinction between trades from the notation.

We now relate the supply of effective labor by craftsmen L in efficiency units to the number of craftsmen N and the state of knowledge k. Manufacturing consists in a set of independent master craftsmen, each one working on their own. Craftsmen are heterogenous in knowledge. The productive knowledge of a craftsman i is measured by a cost parameter  $h_i$ , where a lower  $h_i$  implies that the master can produce at lower cost and hence has more productive knowledge. Intuitively, different craftsmen may apply different methods and techniques in their production, which vary in productivity. Specifically, the output  $q_i$  of a craftsman with knowledge  $h_i$  is given by:

$$q_i = h_i^{-\theta}. (4)$$

The final-goods technology (2) is operated by a competitive industry. Given the Cobb-Douglas production function, this implies that craftsmen receive share  $1 - \alpha$  of total output as compensation for their labor, and consequently the labor income of a craftsman supplying  $q_i$  efficiency units of craftsmen's labor is:

$$I_i = q_i \left( 1 - \alpha \right) \frac{Y}{L}. \tag{5}$$

<sup>&</sup>lt;sup>15</sup>This point is made explicit in Appendix A, where we extend the model to allow for a farming sector. <sup>16</sup>This implies that more productive masters cannot hire other masters to increase production, gain market share, and force less efficient masters to close down their workshop.

The heterogeneity in the cost parameter  $h_i$  among craftsmen takes the specific form of an exponential distribution with distribution parameter k:

$$h_i \sim \text{Exp}(k)$$
.

Given the exponential distribution, the expectation of  $h_i$  is given by  $\mathbb{E}[h_i] = k^{-1}$ . Hence, higher knowledge k corresponds to a lower average cost  $h_i$  and therefore higher productivity. We assume that the same k applies to all trades. Given the exponential distribution for  $h_i$  and (4), output  $q_i$  follows a Fréchet distribution with scale parameter  $k^{\theta}$  and shape parameter  $1/\theta$ . 17

We can now express the total supply of effective labor by craftsmen as a function of state variables. The average output across craftsmen is given by:

$$q = \mathbb{E}(q_i) = \int_0^\infty h_i^{-\theta} \left( k \exp(-kh_i) \right) dh_i = k^{\theta} \Gamma(1 - \theta), \tag{6}$$

where  $\Gamma(t) = \int_0^\infty x^{t-1} \exp(-x) dx$  is the Euler gamma function. The total supply of effective craftsmen's labor L is then given by the expected output per craftsman  $\mathbb{E}(q_i)$  multiplied by the number of craftsmen N:

$$L = N k^{\theta} \Gamma(1 - \theta). \tag{7}$$

Income per capita can be computed from (2) and (7) as:

$$y = \frac{Y}{N} = \frac{L^{1-\alpha}}{N} = \Gamma(1-\theta)^{1-\alpha} k^{(1-\alpha)\theta} N^{-\alpha}.$$
 (8)

## 3.2 Population Growth and the Malthusian Constraint

So far, we have described how total output (and hence output per adult) depends on the aggregate state variables N and k. Next, we specify how these state variables evolve over time. We start with population growth. Consistent with evidence from pre-industrial

<sup>&</sup>lt;sup>17</sup>The Fréchet distribution also implies that growth in knowledge k shifts up productivity proportionally without changing the shape of the distribution; all quantiles of the knowledge distribution are proportional to the mean  $k^{\theta}$ , and standard measures of inequality and dispersion (such as the Gini coefficient) are independent of k.

economies (see Ashraf and Galor 2011), the model allows for Malthusian dynamics. <sup>18</sup> The presence of land in the aggregate production function implies decreasing returns for the remaining factor L, which gives rise to a Malthusian tradeoff between the size of the population and income per capita. The second ingredient for generating Malthusian dynamics is a positive feedback from income per capita to population growth. While often this relationship is modeled through optimal fertility choice, <sup>19</sup> we opt for a simpler mechanism of an aggregate feedback from income per capita to mortality rates. Every adult gives birth to a fixed number  $\bar{n} > 1$  of children. The fraction of children that survives to adulthood depends on aggregate output per adult y, namely:

$$n = \bar{n} \min [1, sy]. \tag{9}$$

Here min[1, sy] is the fraction of surviving children, and n is the number of surviving children per adult. This function captures that low living standards (e.g., malnutrition) make people (and in particular children) more susceptible to transmitted diseases, so that low income per capita is associated with more frequent deadly epidemics. In recent times, we can also envision s to depend on medical technology (i.e., the invention of antibiotics would raise s). However, given that we analyze preindustrial growth, we will assume that s is fixed. We will also focus attention on a phase of development where the mortality tradeoff is still operative, so that survival is less than certain and  $n = \bar{n}sy$ . The law of motion for population then is:

$$N' = n N = \bar{n} s y N = \bar{n} s Y.$$

Consider a balanced growth path in which the stock of knowledge *k* grows according to a constant growth factor *g*:

$$g = \frac{k'}{k}$$
.

In such a balanced growth path, the Malthusian features of the model economy impose a relationship between growth in knowledge g and population growth n, as shown in Proposition 1.

<sup>&</sup>lt;sup>18</sup>Empirical work has found both a fertility and a mortality link to income per capita in medieval England, but gradually weakening over time (Kelly and Ó Gráda 2012 and 2014). Our results for institutional comparisons would be similar in a framework that allows for growing income per capita even in the long term.

<sup>&</sup>lt;sup>19</sup>Fertility preferences can be motivated through parental altruism (Barro and Becker 1989 and applied in a Malthusian context by Doepke 2004, among others) or through direct preferences over the quantity and quality of children (e.g., Galor and Weil 2000 and de la Croix and Doepke 2003).

#### Proposition 1 (The Malthusian Constraint).

Along a balanced growth path, the growth factor of technology g and the growth factor of population n satisfy:

$$g^{\theta(1-\alpha)} = n^{\alpha}. (10)$$

**Proof.** Income per capita y is given by (8). Along a balanced growth path, y is constant, and hence (10) has to hold in order to keep the right-hand side of (8) constant, too.

The Malthusian constraint states that faster technological progress is linked to higher population growth. Given (10), a faster rate of technological progress is also associated with a higher level of income per capita. Income per capita is constant in any balanced growth path: Malthusian dynamics rule out sustained growth in living standards, because accelerating population growth ultimately would overwhelm productivity growth. Instead, economies with faster accumulation of knowledge will be characterized by faster population growth and hence, over time, increasing population density.

#### 3.3 Apprenticeship, Innovation, and the Evolution of Knowledge

We now turn to the accumulation of knowledge in our model economy. In a given period, all productive knowledge is embodied in the adult workers. During childhood, people have to acquire the productive knowledge of the previous generation. There are two sources of increasing knowledge across generations. First, craftsmen are heterogeneous in their productive knowledge. Young craftsmen can learn from multiple adult craftsmen, and then apply the best of what they have learned. This knowledge dissemination process results in endogenous technological progress. In addition, after having acquired knowledge from the elders, young craftsmen can innovate, i.e., generate an idea that may improve on what they have learned, resulting in a second source of technological progress.

In order to model the idea that apprentices (or their parents) are subject to imperfect information on the efficiency of the different masters, we assume that the young can observe the efficiency of masters only by working with them as apprentices. Consider an apprentice who learns from m masters indexed from 1 to m (the choice of m will be discussed below). The efficiency  $h_L$  learned during the apprenticeship process is:

$$h_L(m) = \min\{h_1, h_2, \dots, h_m\}.$$
 (11)

Hence, apprentices acquire the cost parameter of the most efficient (i.e., lowest cost) master they have learned from. After learning from masters, craftsmen attempt to innovate by generating a new idea characterized by cost parameter  $h_N$ . The quality of the idea is random, and it may be better or worse than what they already know. As adult craftsmen, they use the highest efficiency they have attained either through learning from elders or through innovation, so that the final cost parameter h' is given by:

$$h' = \min\left\{h_L, h_N\right\}. \tag{12}$$

As will become clear below, the model can generate sustained growth even if the rate of innovation is zero (i.e., own ideas are always inferior to acquired knowledge). In that case, the dissemination process of existing ideas is solely responsible for growth. However, allowing for innovation allows for a positive rate of productivity growth even if each child learns only from a single master.

Recall that the distribution of the  $h_i$  among adult craftsmen is exponential with distribution parameter k. The distribution of new ideas is also exponential, and the quality of new ideas depends on existing average knowledge:

$$h_N \sim \operatorname{Exp}(\nu k)$$
.

That is, the more craftsmen already know, the better the quality of the new ideas generated. The parameter  $\nu$  measures relative importance of transmitted knowledge and new ideas. If  $\nu$  is close to zero, most craftsmen rely on existing knowledge, and if  $\nu$  is large, innovation rather than the dissemination of existing ideas through apprenticeship is the key driver of knowledge.

The exponential distributions for ideas imply that, given the knowledge accumulation process described by (11) and (12), the knowledge distribution preserves its shape over time (as in Lucas 2009). Specifically, if each young craftsman learns from m masters that are drawn at random we have:<sup>20</sup>

$$h_L = \min\{h_1, h_2, \dots, h_m\} \sim \operatorname{Exp}(mk),$$
  
 $h' = \min\{h_L, h_N\} \sim \operatorname{Exp}(mk + \nu k).$ 

<sup>&</sup>lt;sup>20</sup>This result follows from the min stability property of the exponential distribution. In particular, if  $h_a$  and  $h_b$  are independent exponentially distributed random variables with rates  $k_a$  and  $k_b$ , then min[ $h_a$ ,  $h_b$ ] is exponentially distributed with rate  $k_a + k_b$ .

Hence, with *m* randomly chosen masters per apprentice, aggregate knowledge *k* evolves according to:

$$k' = (m + \nu)k. \tag{13}$$

The market for apprenticeship interacts with population growth. In particular, if each master takes on a apprentices, and each apprentice learns from m masters, the condition for matching demand and supply of apprenticeships is:

$$N'm = Na. (14)$$

We ignore integer constraints and treat m and a as continuous variables. Below, we will focus on equilibria where each apprentice chooses the same number of masters m, and each master has the same number of apprentices a.

We now arrive at the core of our analysis, namely the question of how the number and identity of masters for each apprentice are determined. Apprenticeship is associated with costs and benefits. While working as an apprentice with a master, each apprentice produces  $\kappa > 0$  units of the consumption good (this is in addition to the output generated by the aggregate production function). This output is controlled by the master. In turn, a master who teaches a apprentices incurs a utility cost  $\delta(a)$ , where  $\delta(0) = 0$ ,  $\delta'(a) > 0$ , and  $\delta''(a) > 0$  (i.e., the cost is increasing and convex in a). Incurring this cost is necessary for transmitting knowledge to the apprentices. We assume for simplicity that the function  $\delta(\cdot)$  is quadratic, i.e.  $\delta(a) = \frac{\delta}{2}a^2$  and that it is the same for all masters. <sup>21</sup>

If a master takes on a apprentices but then puts no effort into teaching, the apprentices still generate output  $\kappa a$  by assisting the master in production. Thus, there is a moral hazard problem: Masters may be tempted to take on apprentices, appropriate production  $\kappa a$ , but not actually teach, saving the cost  $\delta(a)$ .

Dealing with this moral hazard problem is a key challenge for an effective system of knowledge transmission. The danger of moral hazard is especially severe here because the very nature of apprenticeship defines it as the quintessential incomplete contract (see Section 2). In a modern market economy, we envision that such problems are dealt with by a centralized system of contract enforcement. In such a system, a parent would write contracts with masters to take on the children as apprentices. A price would be

<sup>&</sup>lt;sup>21</sup>Historically, the cost of training apprentices probably involved other components that may have varied with the quality of the master, such as his opportunity costs and the materials and equipment used by apprentices while learning. If opportunity costs were a major component of these costs, there would be one reason why the most skilled masters might have charged a higher price for taking on apprentices.

agreed on that is mutually agreeable given the cost of training apprentices and the parent's desire, given altruistic preferences (1), to provide the children with future income. Courts would ensure that both parties hold up their end of the bargain.

In pre-industrial societies lacking an effective system of contract enforcement, other institutions would have to ensure an effective transmission of knowledge from the elders to the young. Our view is that variation in these alternative institutions across countries and world regions plays a central role in shaping economic success and failure in the pre-industrial era. After a brief discussion of model assumptions, we analyze specific, historically relevant institutions in the context of our model of knowledge-driven growth.

#### 3.4 Discussion of Model Assumptions

Our model of growth in the pre-industrial economy is stylized and relies on a set of specific assumptions that yield a tractable analysis. We conclude our description of the model with a discussion of the role and plausibility of the assumptions that are most central to our overall argument.

Above all, apprenticeship institutions matter in our economy because the knowledge of masters is not publicly observable. This creates the incentive for apprentices to sample the knowledge of multiple masters to gain productive knowledge, and implies that institutions that determine how apprentices are matched to masters matter for growth. To maintain tractability, in the model the lack of information on productivity is severe: Nothing at all is known about the productivity of different masters, even though there is wide variation in their actual productivity. Taken at face value, this assumption is clearly implausible. However, possible concerns about its role can be addressed in two ways.

First, in our model all knowledge differences between masters are actual productivity differences, i.e., masters who know more produce more. A realistic alternative possibility is that at least some variation in knowledge is in terms of "latent" productivity, i.e., some masters may know techniques and methods that will turn out to be highly productive and important at a later time when combined with other knowledge, but do not give a productivity advantage in the present. A well known example are the inventions of Leonardo da Vinci which could not be implemented given the knowledge of his age, but which turned into productive knowledge centuries later. Similarly,

the success of the steam engine was based in large part on a set of gradual improvements in craftmen's ability to work metal to precise specifications; for instance, steam engines work only if the piston can move easily in the cylinder but with a tight fit. Many improvements in techniques would have been of comparatively little value when first invented, but then became critical later on. Along these lines, in Appendix B we describe an extension of our model where a craftsman's output can be constrained by the state of aggregate knowledge. This version leads to exactly the same implications as the simpler setup described here, but actual variation in productivity is much smaller than variation in latent productivity, so that imperfect information on underlying productivity appears more plausible. The extended model is also useful for addressing another potential concern about the model, namely that the support of latent knowledge is unbounded, with a fat-tailed distribution that allows, in principle, for sustained growth based entirely on knowledge diffusion. At face value, this assumption implies that all potential knowledge is already known to at least one person at the beginning of time, which may be regarded as implausible. However, the extended model makes clear that this setting can be regarded as a simple analytical approximation to a model with a finite support of knowledge. In particular, if the knowledge distribution is cut off at some upper bound and replaced with a point mass at the bound, we would get the same results for the growth implications of different apprenticeship institutions, and overall similar equilibrium outcomes in the short and medium run.

Second, it would be possible to relax the assumption of total lack of information about productivity, and instead assume that an informative, but imperfect, signal of each master's productivity was available.<sup>22</sup> In such a setting, more productive masters could command higher prices for apprenticeships, they would employ a larger number of apprentices, and the spread of productive knowledge would be faster. As we document in Section 2, the historical evidence for Europe suggests that, indeed, more productive and knowledgeable masters were able to command higher prices and attract more apprentices. However, as long as information on productivity is less than perfect, the basic tradeoffs articulated by our analysis and the comparative growth implications of the institutions analyzed below would be the same. Less-than-perfect information about productivity is highly plausible; even in today's world of instant communication and online discussion boards, for example, graduate students do not have perfect information about which advisor will be the best match for them. We adopt the extreme case of

<sup>&</sup>lt;sup>22</sup>See Jovanovic (2014) for a study where a signal of skill is available, and assortative matching of young and old workers is an important driver of growth.

complete lack of observability for tractability; without this assumption the distribution of knowledge would not preserve its shape over time, so that we would have to rely on numerical simulation for all results.<sup>23</sup> It should also be noted that in a world of artisans and small workshops there were limits on the number of apprentices that each master could take on. Diseconomies of scale would set in fairly soon, even if there were no guild limitations on the number of apprentices (which often existed). This means that the standard mechanism through which technology diffuses (the more efficient firms expand and take over the industry) was not operative in this period.

In addition, the master-apprentice relationship in the model is simplified compared to reality. We use a setting with one-sided moral hazard, i.e., masters can cheat apprentices, but not vice versa. In reality, moral hazard was a major concern on both sides of the master-apprentice relationship. This assumption is introduced merely to simplify the analysis. It would be straightforward to introduce two-sided moral hazard in our setting, and the role of institutions for mitigating moral hazard would be unchanged. We also assume that the only reason why apprentices get differential training is because they work with heterogeneous masters—we do not allow for the apprentices to differ in talent. <sup>25</sup>

Finally, in the model apprentices interact in the same way with all masters they learn from, and they make a one-time choice of the number of masters to learn from. As ever, reality is substantially more complicated; choices of whom to learn from unfolded sequentially over time, and most apprentices generally did only one full apprenticeship (although changing masters was actually not uncommon, see Bellavitis, Cella, and Colavizza 2016, Crowston and Lemercier 2016, and Schalk 2016), followed by other shorter interactions during journeymanship. Once again, these assumptions are for simplicity and tractability, but are not central to our main results regarding the role

<sup>&</sup>lt;sup>23</sup>Luttmer (2015) provides an alternative approach for modeling the assignment of students to teachers. Luttmer's model has the advantage of allowing for observability and not relying on an unbounded support of existing knowledge, albeit at the cost of a considerably more complex analysis.

<sup>&</sup>lt;sup>24</sup>The existence of two-sided moral hazard might in practice have made the problem better. The master might have an incentive to invest in teaching his apprentice and create loyalty if some of the compensation to masters came in the form of labor that the apprentice carried out for the master in the later stages of his apprenticeship.

<sup>&</sup>lt;sup>25</sup>If candidates are different from one another and the differences in talent is observable, one might expect assortative matching in that the most talented apprentices would be allocated to the most productive masters. We actually see this kind of matching in the data: the great London machine-tool maker Joseph Bramah trained the equally famous Henry Maudslay, who in turned trained some of the best mechanics and engineers of the nineteenth century. Such heterogeneity in the talent of the apprentices themselves would be an interesting extension of our model but again at the cost of greater complexity.

of institutions for knowledge transmission. The key point in the theoretical setup is that apprentices adopt the techniques of the most efficient master they learned from. It is not necessary that apprentices spend equal time with each master; in reality, an interaction may be brief and end once an apprentice ascertains that a given master has nothing new to offer. The model abstracts from such differentiated interactions and imposes symmetrical master-apprentice relations to improve tractability. Having said that, when matching the model to data, care should be taken to account for the fact that "apprenticeships" in the model correspond to a wider range of interactions in reality. Some of these real-world interactions may also consist of horizontal diffusion of techniques in which artisans learn from one another. While be abstract from such interactions in the theoretical model, the historical evidence about the mobility of artisans and journeymen suggests that such horizontal dissemination was an important element in the dissemination of technical knowledge.

# 4 Comparing Institutions for Knowledge Transmission

The crucial question in our theory is how the moral hazard problem inherent in apprenticeship is resolved. If masters do not make an effort to teach their apprentices, parents will have no incentive to send children to learn from masters outside the family. Apprentices would not learn anything, whereas masters would gain the apprentices' production  $\kappa$ . Parents would be better off keeping children at home, thereby keeping output  $\kappa$  in the family. Thus, for apprenticeship outside the immediate family to be feasible (and thus for knowledge to disseminate), an enforcement mechanism is required in order to provide incentives for masters to exert effort.

#### 4.1 Centralized versus Decentralized Institutions

We consider two types of institutions, characterized by centralized versus decentralized enforcement. Under centralized enforcement, people can write contracts specifying that the master must put in effort (and indicating the price of apprenticeship), and there is a centralized system (such as courts) that punishes anyone who breaks a contract. In contrast, in a decentralized system no such central authority exists, and instead people have to form coalitions to maintain a sufficient threat of punishment to resolve the moral hazard problem.<sup>26</sup>

<sup>&</sup>lt;sup>26</sup>We should note that in reality, the distinction between centralized and decentralized institutions is less sharp than in our theory. Even where centralized enforcement institutions existed, they were often

To allow for the possibility of decentralized enforcement, we assume that each adult can inflict a utility cost (damage) on any other adult.<sup>27</sup> However, the punishment that a single adult can mete out is not sufficient to induce a master to put in effort, i.e., the punishment is lower than the cost of training a single apprentice. In contrast, coalitions of people can always make threats that are sufficient to guarantee compliance. An effective threat of punishment therefore requires coordination among parents. Coordination, in turn, requires communication: For a master's shirking to have consequences, the fact of the shirking has to be communicated to all would-be punishers. Thus, the extent to which people are able to communicate with each other partly determines how much knowledge transmission is possible.

Over time, societies have differed in the extent and manner in which individuals were connected in communication networks. We consider two different scenarios for decentralized enforcement, the "family" and the "clan," which we consider particularly relevant for contrasting Europe during the Early Middle Ages with China, India, and the Middle East during the same period and beyond.

The decentralized systems correspond to a period when centralized enforcement was not yet sufficiently effective. Even if courts existed, contract enforcement was often costly, slow, and uncertain. More importantly, for centuries the reach of the state and hence its courts was severely limited. Europe, for example, used to consist of hundreds of independent sovereign entities, and the enforcement of the law outside one's immediate surroundings (say, the city of residence) was weak. With this in mind, the first centralized enforcement institution that we consider is organized not by the state but by a coalition of all the masters in a given trade: a "guild." The guild monitors the behavior of its members and enforces the apprenticeship contracts between parents and masters. However, the guild also has anti-competitive features. It can set the price of apprenticeship, thereby exploiting its monopoly in a given trade. Guilds played a central role in European economic life during the Middle Ages, and our theory will allow us to assess their implications for knowledge creation and dissemination.

The final institution that we consider is the "market," where there is a centralized enforcement system for all trades as in a modern market economy. Importantly, under this institution the government not only enforces contracts, but also prevents collusion;

complemented by a self-enforcing mechanism based on trust and reputation (Humphries 2003; Mokyr 2008).

<sup>&</sup>lt;sup>27</sup>The cost can be interpreted as physical punishment, as destruction of property, or as spreading rumors that induce others not to buy from the individual in question.

trades are no longer allowed to form guilds that limit entry and lower competition, and both parents and masters act as price takers. The market institution corresponds to the final stages of the pre-industrial economy, when in Europe nation states became powerful and increasingly abolished the traditional privileges of guilds.

### 4.2 The Family

Decentralized institutions enforce apprenticeship agreements through the formation of coalitions of parents that coordinate on a sufficient threat of punishment for shirking masters. Different decentralized institutions are distinguished by the size of these coalitions and the identity of their members. For the formation of a coalition to be feasible, the members have to be able to communicate with each other about the behavior of masters. Hence, one polar case is where members of different families are unable to communicate with each other, so that no coalitions can be formed. The lack of communication rules out coordinating on punishing shirking masters. As a consequence, apprenticeship outside the immediate family is impossible, i.e., each child learns only from the parent. In principle, the moral hazard problem is present even within the family. However, in utility (1) parents care about their own children, and we assume that the degree of altruism  $\gamma$  is sufficiently high for parents never to shirk when teaching their own children. The result is a "family equilibrium," i.e., an equilibrium where knowledge is transmitted only within dynasties, but there is no dissemination of knowledge across dynasties.

Formally, under decentralized institutions we model the knowledge accumulation decisions as a game between the craftsmen of a given generation. The strategy of a given craftsman has three elements:

- 1. Decide whether to send own children to others as apprentices for training, and if so, which compensation to pay the masters of one's children.
- 2. Decide whether to exploit one's own apprentices (if any).
- 3. Decide whom to punish (if anyone).

We focus on Nash equilibria.<sup>28</sup> The strategy profile for the family equilibrium is as follows:

<sup>&</sup>lt;sup>28</sup>Given that there are subsequent generations, one could also define a dynamic game involving all generations. However, given that preferences are of the warm-glow type, decisions of future generations do not affect the payoffs of the current generation, so that dynamic considerations do not change the strategic tradeoffs faced by the players.

- All craftsmen train their children on their own.
- If (off the equilibrium path) a master gets someone else's child as an apprentice, the master exploits the apprentice.
- No one ever punishes anyone.

If communication outside the immediate family is impossible, the family equilibrium is the only equilibrium. The family equilibrium can also occur as a "bad" equilibrium in an economy where more communication links are available, but people fail to coordinate on a more efficient punishment equilibrium.<sup>29</sup>

Now consider the balanced growth path under the family equilibrium. We assume that the Malthusian feedback, parameterized by the maximum number of children  $\bar{n}$  and the survival parameter s, is sufficiently strong for dynamics to lead to a balanced growth path in which income per capita is constant.<sup>30</sup> The following proposition summarizes the properties of the balanced growth path.

#### Proposition 2 (Balanced Growth Path in Family Equilibrium).

If altruism is sufficiently strong (i.e.,  $\gamma$  is sufficiently large), there exists a unique balanced growth path under the family equilibrium with the following properties:

- (a) Each child trains only with his own parent:  $m^F = 1$ , and  $a^F = n^F$ .
- (b) The growth factor  $g^{F}$  of knowledge k is:

$$g^{\text{F}} = 1 + \nu$$
.

(c) The growth factor  $n^F$  of population N is:

$$n^{\mathrm{F}} = (1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}}.$$

(d) Income per capita  $y^F$  is constant and satisfies:

$$y^{\mathrm{F}} = \frac{(1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}}}{\bar{n}\,s}.$$

# Proof. See Appendix C.

<sup>&</sup>lt;sup>29</sup>For any communication structure, the family equilibrium always exists, because in the expectation that no one else will punish shirking masters it is optimal to (i) never punish shirking masters either and (ii) not send one's own children to be apprenticed outside the family.

<sup>&</sup>lt;sup>30</sup>The required assumptions can be made precise; what is key is that maximum population growth is larger than the maximum rate of effective productivity growth.

The condition for sufficient altruism reflects that parental altruism should be strong enough to overcome the disutility of teaching one's children. The rate of technological progress is positive in the family equilibrium, but small. In the absence of new ideas ( $\nu = 0$ ), there is stagnation ( $g^F = n^F = 1$ ). This is because the only source of progress is the new ideas of craftsmen (recall that  $\nu$  measures the quality of new ideas). New ideas are passed on to children, which makes children, on average, more productive than the parents. However, knowledge does not disseminate across dynasties. Given the growth rate of knowledge  $g^F = 1 + \nu$ , Malthusian dynamics ensure that population grows just fast enough to offset productivity growth and yield constant income per capita.

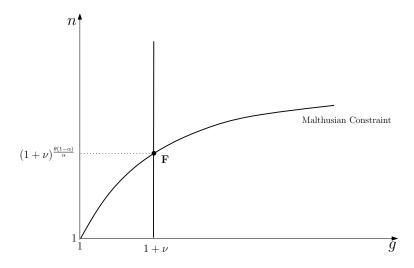


Figure 1: Productivity and Population Growth in the Family (F) Equilibrium

Figure 1 represents the determination of the balanced growth path in the family equilibrium. The concave curve represents the Malthusian constraint given by (10).<sup>31</sup> The intersection between this constraint and the line  $g = 1 + \nu$  gives the balanced growth path under the family equilibrium **F**.

#### 4.3 The Clan

Next, we consider economies where there is communication within an extended family or clan. While many other structures could be considered, the clan has particular historical significance because of its importance for organizing economic exchange in the major world regions outside Europe. Formally, we consider a setting where all members of a

The curve is concave if  $\theta(1-\alpha) < \alpha$ , but results to do not depend on this condition.

dynasty who share an ancestor o generations back can communicate (here o = 0 corresponds to the family equilibrium, o = 1 means siblings are connected, and so on). Now consider a potential "clan equilibrium" with the following equilibrium strategy profiles:

- All craftsmen send their children to be trained by each master in the clan, and parents compensate masters for the apprenticeship by paying each  $\delta'(a) \kappa$  (the marginal cost), where a is the number of apprentices per master.
- All masters put effort into teaching.
- If (off the equilibrium path) a master cheats an apprentice, all current members of the clan punish the master.

For example, if o = 1, children are trained not only by their parent, but also by their uncles. For o = 2, second-degree relatives serve as masters, and so on.<sup>32</sup> Along a balanced growth path, the total number of adults (i.e., masters) belonging to the clan is  $(n^c)^o$ , where  $n^c$  is the rate of population growth in the balanced growth path. For learning from all current masters to be feasible, we assume that all members of the clan work in the same trade. An alternative setup allows for large clans that engage in many trades, in which case a child would be trained only by those masters in the clan who work in the child's chosen trade. In either case, we envision that in the clan equilibrium children obtain the knowledge of a handful of masters who belong to the same clan and to the same trade.

The following proposition summarizes the properties of the balanced growth path in the clan equilibrium.

### Proposition 3 (Balanced Growth Path in Clan Equilibrium).

There is threshold  $o_{max} > 0$  such that if  $o < o_{max}$  and if altruism is sufficiently strong (i.e.,  $\gamma$  is sufficiently large), there exists a balanced growth path in the clan equilibrium with the following properties:

(a) The number of masters per child m is given by the number of adults in the clan,  $m^c = (n^c)^o$ , and the number of apprentices per master is  $a^c = (n^c)^{o+1}$ .

 $<sup>^{32}</sup>$ In reality, it may not be necessary to receive full training from all clan members. Instead, one could assume that apprentices initially search over the entire group, sample the masters' knowledge, but then spend most of their time learning from the clan member identified to have the lowest h. We adopt the simpler notion of learning equally from all masters to preserve the symmetry that makes the problem tractable.

(b) The growth factor  $g_k^c$  of knowledge k is the solution to:

$$g^{c} = 1 + \frac{\nu (n^{c})^{o}}{g^{c} - \nu}.$$
 (15)

(c) The growth factor  $n_k^c$  of population N is given by:

$$n^{c} = (g^{c})^{\frac{(1-\alpha)\theta}{\alpha}}.$$

(d) Income per capita is constant and satisfies:

$$y^{c} = \frac{\left(g^{c}\right)^{\frac{(1-\alpha)\theta}{\alpha}}}{\bar{n}s}.$$

For o = 0, the balanced growth path coincides with the family equilibrium, whereas for o > 0 knowledge growth, population growth, and income per capita are higher compared to the family equilibrium. The growth  $g^c$  of knowledge k is increasing in the size of the clan o.

### **Proof.** See Appendix D.

Parallel to the family equilibrium, the condition on sufficiently high altruism ensures that parents find it worthwhile to pay for the training of their children.<sup>33</sup> The upper bound  $o_{\text{max}}$  on the size of the clan limits productivity growth to a level where the Malthusian feedback is sufficiently strong to generate a balanced growth path with constant income per capita.

The clan equilibrium leads to a higher growth rate compared to the family equilibrium because children learn from more masters. In particular, they benefit not just from the new ideas of their own parent, but also from the new ideas of their uncles and other current members of the clan. Thus, new knowledge disseminates more widely compared to the family equilibrium. However, there is still no dissemination of knowledge across clans. Equation (15) implies that as long as  $\nu > 0$  (there is some innovation), a higher  $\sigma$  (larger clans) leads to faster growth. However, if there are no new ideas,  $\nu = 0$ , the growth rate in the clan equilibrium is zero. Intuitively, in a clan the masters of a given

<sup>&</sup>lt;sup>33</sup>Another possibility is that altruism is at a level sufficient for parents to want to send their children to some, but not all, available masters. Characterizing the balanced growth path in this case is more complicated, because the selection of which masters to train with is non-trivial. Nevertheless, the basic shortcoming of the clan-based institution, namely that different masters have similar knowledge and so less new knowledge can be gained by getting trained by more of them, would still apply in this type of equilibrium.

apprentice all trained with the same masters when they were apprentices, which implies that they all started out with the same knowledge. If the masters don't have new ideas of their own, studying with multiple masters does not provide any benefit over studying with only one of them. Hence, knowledge does not accumulate across generations.

Another way of stating this key point is that learning opportunities in the clan are limited, because the knowledge of the available masters is correlated. This correlation arises from the fact that the available masters once learned from the same teachers, and hence acquired the same pooled knowledge present within the clan. As we will see, this issue of correlated knowledge across masters is the key distinction between the clan and institutions such as the guild and the market that extend beyond blood relatives.

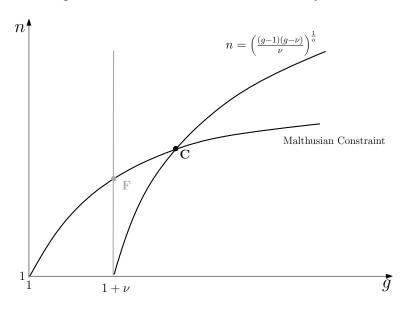


Figure 2: Productivity and Population Growth in the Clan (C) Equilibrium

Figure 2 represents the determination of the balanced growth path in the clan equilibrium. In addition to the Malthusian constraint (10), we have drawn the function

$$n = \left(\frac{(g-1)(g-\nu)}{\nu}\right)^{\frac{1}{o}},\tag{16}$$

which is derived from (15). This function is equal to one when  $g = 1 + \nu$ , increases monotonically with g for  $g > 1 + \nu$ , and ultimately crosses the Malthusian constraint. The function (16) captures the relationship between population growth and the size of the clan. When n = 1, every person has one child, and hence there are no siblings and

no uncles. Therefore, children can learn only from their own parent, who is the sole adult member of the clan. At higher rates of population growth, the clan is bigger, and hence there are more masters who generate ideas and whom the young can learn from, resulting in faster technological progress.

#### 4.4 The Market

At the opposite extreme (compared to the family) of enforcement institutions, we now consider outcomes in an economy with formal contract enforcement (as in the usual complete-markets model). All contracts are perfectly and costlessly enforced, so that masters who promise to train apprentices do not shirk.<sup>34</sup> There is a competitive market for apprenticeship. Given market price p for training apprentices, masters decide how many apprentices to train, and parents decide how many masters to pay to train their children. In equilibrium, p adjusts to clear the apprenticeship market.

A craftsman's decision to take on apprentices is a straightforward profit maximization problem. In particular, given price p a master will choose the number of apprentices a to solve:

$$\max_{a} \left\{ p a + \kappa a - \delta(a) \right\}.$$

The benefit of taking on apprentices derives from the price p as well as the apprentices' production  $\kappa$ , and the cost is given by  $\delta(a)$ . Optimization implies that in equilibrium the price of apprenticeship equals the marginal cost of training an apprentice:

$$p = \delta'(a) - \kappa$$
.

Now consider parents' choice of the number of masters m that their children should learn from. Given p, parents will choose m to maximize their utility (1):

$$\max_{m} \left\{ -p \, m \, n + \gamma \, \mathbb{E} \, I' \right\},\,$$

where n is the number of children and I' is the income of the child, which is given by (5). Each child's expected income depends on m, because learning from a larger number of masters increases the expected productivity (and hence income) of the child.

<sup>&</sup>lt;sup>34</sup>We assume that even though the knowledge of the master is unobservable, the act of teaching is not, and the only choice for the master is to either transmit the actual skill or not to teach at all. Hence, being able to observe whether the master teaches is sufficient to allow contract enforcement.

The objective function is concave, because as *m* rises, the probability that an additional master will have the highest productivity declines.

**Lemma 1.** *The first-order condition for the parent's problem implies:* 

$$\delta'(a) - \kappa = \gamma \,\theta(1 - \alpha) \frac{1}{m + \nu} \frac{Y'}{N'}. \tag{17}$$

### **Proof.** See Appendix E.

Notice that the decision problem implicitly assumes that the young apprentice gets *m* independent draws from the distribution of knowledge among the elders, as though the masters were drawn at random. The possibility of independent draws from the knowledge distribution is a key advantage of the market system over the clan system. In a clan, the potential masters have similar knowledge (because they learned from the same "grand" master), and hence the gain from studying with more of them is limited (there is still some gain because of the new ideas generated by masters). Of course, it would be even better to study only with masters known to have superior knowledge. We assume, however, that a master's knowledge can be assessed only by studying with them; hence, choosing masters at random is the best one can do.

The market equilibrium gives rise to a unique balanced growth path, which is characterized in the following proposition.

### Proposition 4 (Balanced Growth Path in Market Equilibrium).

The unique balanced growth path in the market equilibrium has the following properties:

(a) The number of apprentices per master  $a^{M}$  solves (17):

$$\delta'(a^{\mathbf{M}}) - \kappa = \gamma \,\theta(1 - \alpha) \frac{1}{a^{\mathbf{M}}/n^{\mathbf{M}} + \nu} y^{\mathbf{M}},\tag{18}$$

and the number of masters per child  $m^{M}$  is the solution to  $m^{M} = a^{M}/n^{M}$ .

(b) The growth factor  $g^{M}$  of knowledge k is given by:

$$g^{\mathbf{M}} = m^{\mathbf{M}} + \nu.$$

(c) The growth factor  $n^{M}$  of population N is given by:

$$n^{\mathbf{M}} = (g^{\mathbf{M}})^{\frac{(1-\alpha)\theta}{\alpha}}.$$

### (d) Income per capita is constant and satisfies:

$$y^{\mathbf{M}} = \frac{\left(g^{\mathbf{M}}\right)^{\frac{(1-\alpha)\theta}{\alpha}}}{\bar{n}\,s}.$$

The market equilibrium yields higher growth in productivity and population and higher income per capita than does the clan equilibrium and the family equilibrium.

To analyze the equilibrium, we can plug the expressions for  $a^{M}$ ,  $m^{M}$ , and  $y^{M}$  into (17) to get:

$$\delta'((g^{\mathsf{M}} - \nu)n^{\mathsf{M}}) - \kappa = \gamma \theta (1 - \alpha) \frac{1}{g^{\mathsf{M}}} \frac{n^{\mathsf{M}}}{\bar{n} \, s}. \tag{19}$$

This equation describes a relationship between  $g^{M}$  and  $n^{M}$  which we call the "apprenticeship market," as it is derived from demand for apprenticeship and the equilibrium condition on the apprenticeship market. Equation (19) can be rewritten as:

$$n^{\mathsf{M}} = \frac{\kappa}{\bar{\delta}(g^{\mathsf{M}} - \nu) - \frac{\gamma \theta (1 - \alpha)}{\bar{n} \, s \, g^{\mathsf{M}}}} \tag{20}$$

This function of  $g^M$  is plotted in Figure 3. he negative relationship between population growth and the rate of technical progress in (19) can be interpreted as follows. When fertility is higher, the market for apprenticeships is tighter, the equilibrium price of apprenticeship is higher, and parents demand fewer masters. Hence faster population growth is associated with lower productivity growth. Notice that such a feedback does not arise in the family equilibrium, because there apprenticeship is limited by the fact that only parents can serve as masters, rather than being constrained by market forces.

The market equilibrium leads to faster growth than the clan equilibrium does because knowledge is disseminated across ancestral boundaries throughout the entire economy. The masters teaching apprentices represent a wider range of knowledge, implying that more can be learned from them.<sup>35</sup> All of this is made possible by having a different enforcement technology for apprenticeship contracts, namely courts rather than punishment by clan members.

<sup>&</sup>lt;sup>35</sup>The contrast between clan and market equilibrium is an example of social structure being important for economic outcomes; a similar application to technology diffusion is provided in the recent work by Fogli and Veldkamp (2012).

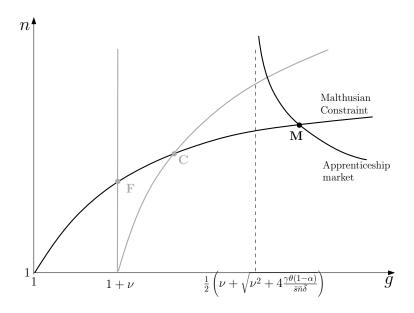


Figure 3: Productivity and Population Growth in the Market (M) Equilibrium

#### 4.5 The Guild

Historically, economies did not transition directly from the family or clan equilibrium to the market equilibrium; rather, there were intermediate stages of semi-formal enforcement through institutions other than the state. In Europe, the key intermediate institution was the guild system, which for centuries regulated apprenticeship and knowledge transmission, at a time when state power was still weak. Craft guild is a generic term for an organization of craftsmen and manufacturers who shared an occupation and hence a training. Yet while they can be found everywhere, their function and power varied enormously both over time and across different regions. In Europe, continental craft guilds in most areas were politically quite powerful and used this power not only to organize the industry but also to monitor its operations and enforce rules. In England, guilds were less powerful and their political influence was much more limited. In the Ottoman Empire, guilds emerged in the sixteenth century but seem to have acted mostly as trade cartels and lobbying bodies, which did little to enforce industry regulations (Faroqhi 2009, pp. 30-40). In China guilds emerged fairly late, and as noted above, often coincided with people of common origin rather than people sharing an occupation.

We now provide a formal characterization of a "guild equilibrium" as an intermediate step between the family equilibrium and the market equilibrium. We envision a guild as an association of all masters involved in the same trade. In the production function (3), the effective labor supply from many different trades is combined with limited substitutability across trades, so that market power can arise. Allowing for heterogeneous labor supply by different trades, the labor income of a craftsman i in trade j is:

$$I_{ij} = q_{ij} (1 - \alpha) \frac{Y}{L} \left(\frac{L_j}{L}\right)^{\frac{1}{\lambda} - 1}.$$

Apprentices choose the most attractive trade. In equilibrium, the net benefit of joining as an apprentice is equalized across trades, so that for all j we have:

$$\mathbb{E} I'_{ij} - p_j m_j = \mathbb{E} q'_{ij} (1 - \alpha) \frac{Y'}{L'} - p m.$$
(21)

Collusion among masters in a given guild leads to social costs and benefits compared to the clan equilibrium. The costs are the usual downsides from limited competition; the guild has an incentive to raise prices and limit entry. Guilds enforced labor market monopsonies, and as a result often limited the number of apprentices that each master was allowed to take on at one time, specified the number of years each apprentice had to spend with his master, or even stipulated time periods that had to elapse between taking on one apprentice and the next (Trivellato 2008, p. 212; Kaplan 1981, p. 283). The purpose of these constraints was to limit supply and increase exclusionary rents, which for our analysis means that technological progress is slowed down compared to a market equilibrium.<sup>36</sup> However, guilds operated across different dynasties and thus represented the full range of knowledge in the given trade. If the guild also enforced apprenticeship contracts (in the same fashion as in the clan equilibrium above), there was more scope for knowledge accumulation. Thus, in the absence of strong centralized contract enforcement institutions (i.e., if the clan and not the market was the relevant alternative), the guild had a genuinely positive role to play.<sup>37</sup>

Consider the choice of a guild j of setting the price of apprenticeship  $p_j$  within the trade, or equivalently, of choosing the number  $a_j$  of apprentices per master. The guild maxi-

<sup>&</sup>lt;sup>36</sup>We focus on the role of guilds in limiting entry because this is what matters for growth in our setting. Another anti-competitive role of guilds is to limit competition in product markets (Ogilvie 2014, 2016). In our model, this feature does not arise because we abstract from an intensive margin of labor supply. We also abstract from the introduction of new goods (as in increasing-variety models of growth); if a new good were a close substitute to wares of an existing guild, the guild would have an additional anti-competitive motive of hindering the introduction of the good.

<sup>&</sup>lt;sup>37</sup>This feature provides a contrast between our work and other recent research on the economic role of guilds, such as Desmet and Parente (2014).

mizes the utility of the masters in the trade. If the guild lowers  $a_j$ , the effective supply of craftsmen's labor in trade j in the next generation goes down. Due to limited substitutability across trades, this increases future craftsmen's income in the trade, and thus the price  $p_j$  that today's apprentices are willing to pay. Thus, as in a standard monopolistic problem, the guild will raise  $p_j$  to a level above the marginal cost of training apprentices. The maximization problem of the guild can be expressed as:<sup>38</sup>

$$\max_{a_j} \left\{ p_j a_j - \delta(a_j) + \kappa a_j \right\} \tag{22}$$

subject to:

$$S_j N' m_j = N a_j,$$
 
$$p_j = \gamma \frac{\partial \mathbb{E} I'_{ij}}{\partial m_j},$$
 
$$\mathbb{E} I'_{ij} - p_j m_j = (1 - \alpha) \frac{Y'}{N'} - p m.$$

Here  $S_j$  is the endogenous relative share of apprentices choosing to join trade j. We have  $S_j = 1$  in equilibrium; however, the guild solves its maximization problem taking the behavior of all other trades as given, so that  $S_j$  varies with  $p_j$  and  $a_j$  in the maximization problem of the guild. The second constraint represents the optimal behavior of parents sending their children to trade j (equalizing  $p_j$  to the marginal benefit of training with an additional master). The third constraint stems from the mobility of apprentices across trades (from (21)). These two equations represent the two market forces limiting the power of the guild. Notice that Y'/N' is exogenous for the guild j, because each trade is of infinitesimal size.

**Lemma 2.** At the symmetric equilibrium, the solution to the maximization problem (22) satisfies:

$$\delta'(a) - \kappa = \Omega(m) \ \gamma \theta(1 - \alpha) \frac{1}{m + \nu} \frac{Y'}{N'}$$
 (23)

with  $\Omega(m) < 1$ .

### **Proof.** See Appendix G.

 $<sup>^{38}</sup>$ To simplify notation, we assume that the children of masters in trade j will look for apprenticeship in other trades. This can be rationalized by a small role for "talent" in choosing trades. Our results do not depend on this assumption, because in equilibrium the returns of entering each trade are equalized.

Thus, the condition determining equilibrium in the apprenticeship market is of the same form as in the market equilibrium (see Lemma 1), but with the benefit from apprenticeship scaled down by a factor strictly smaller than one. Hence, the extent of apprenticeship (and productivity growth) will be lower compared to the market equilibrium. In the limit where trades become perfect substitutes,  $\lambda \to 1$ , we have that  $\Omega(m) \to 1$ , i.e., guilds have no market power and the problem of the guild leads to the same solution as the market (Lemma 1).

We can now characterize the balanced growth path in the guild equilibrium.

### Proposition 5 (Balanced Growth Path in Guild Equilibrium).

The unique balanced growth path in the guild equilibrium has the following properties:

(a) The number of apprentices per master a<sup>G</sup> solves (23):

$$\delta'(a^{\rm G}) - \kappa = \Omega\left(\frac{a^{\rm G}}{n^{\rm G}}\right) \gamma \theta(1 - \alpha) \frac{1}{(a^{\rm G}/n^{\rm G} + \nu)} y^{\rm G},\tag{24}$$

and the number of masters per child  $m^G$  is the solution to  $m^G = a^G/n^G$ .

(b) The growth factor  $g^{G}$  of knowledge k is given by:

$$g^{G}=m^{G}+\nu$$
.

(c) The growth factor  $n^{G}$  of population N is given by:

$$n^{G} = (g^{G})^{\frac{(1-\alpha)\theta}{\alpha}}.$$

(d) Income per capita is constant and satisfies:

$$y^{\rm G} = \frac{\left(g^{\rm G}\right)^{\frac{(1-\alpha)\theta}{\alpha}}}{\bar{n}\,s}.$$

The guild equilibrium yields lower growth in productivity and population and lower income per capita than does the market equilibrium.

## **Proof.** See Appendix H.

The guild equilibrium is represented in Figure 4, where the apprenticeship market is described by Equation (24). This relationship is similar to the apprenticeship market

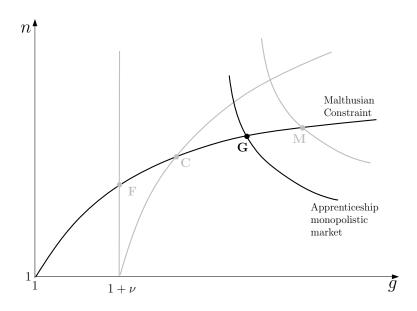


Figure 4: Productivity and Population Growth in the Guild (**G**) Equilibrium

condition in the market equilibrium, but with a shift to the left because of the market power of the guild, represented by the term  $\Omega(\cdot)$ .

For explaining the rise of European technological supremacy, the key comparison is between the growth performance of the guild equilibrium (which we view as representing Europe for much of the period from the Middle Ages to the Industrial Revolution) and the clan equilibrium (a feature of other regions such as China, India, and the Middle East). There are forces in both directions; guilds foster growth compared to clans because knowledge can disseminate across ancestral lines, but at the same time the anticompetitive behavior of guilds may limit access to apprenticeship. For this reason, the ranking of growth rates depends on parameters. The guild will lead to faster growth if  $\lambda$  is sufficiently small, because a low  $\lambda$  (close to 1) implies that guilds have little market power, so that the guild equilibrium is close to the market equilibrium. Moreover, the guild also generates faster growth if the rate of innovation  $\nu$  (i.e., the relative efficiency of new versus existing ideas) is close to zero. In this case, most growth is due to the dissemination of existing ideas rather than to the generation of new knowledge, and guilds dominate clans in terms of dissemination (recall that the growth rate in the clan equilibrium is zero if  $\nu=0$ ).

Perhaps the most important comparison is that the guild would always lead to more growth than the clan if the number of masters *m* were the same in both systems. In the

guild, conditional on m, masters are selected in the best possible way (namely as independent draws from the distribution of knowledge, which maximizes the probability that something new can be learned from an additional master). While the guild may limit access to apprenticeship, it does benefit from allowing for an efficient choice of masters, because this raises the expected benefit of learning from masters and hence the price apprentices are willing to pay. Put differently, the guild distorts only the quantity, but not the quality of apprenticeship. In contrast, in the clan the knowledge of the multiple masters that a given apprentice learns from is necessarily correlated, given that all masters started out with the same initial knowledge available in the clan. Thus, for a given *m*, in a clan apprentices are exposed to a smaller variety of ideas, and (on average) they learn less. Hence, the only scenario where the clan could generate more growth than the guild is where the market power of guilds is so strong that they would reduce *m* to well below the level prevalent in the clan. If anything, the historical evidence points in the opposite direction. Through the multiple interactions that apprenticeship and journeymanship provided, the European guild system is likely to have offered at least as many learning opportunities as the contemporary clan based system did. From the perspective of our model, faster technological progress in Western Europe compared to other world regions would then be the necessary consequence.

# 5 The Rise of Europe's Technological Primacy

A central question about pre-industrial economic growth is how, in the centuries leading up to the Industrial Revolution, Western Europe came to achieve technological primacy over the previous leaders. We argue that this technological primacy was due to the synergistic growth of both tacit (artisanal) and codified (formal) knowledge. In many branches of production the skills of the craftsman and the engineer, learned through apprenticeship, were needed to carry out and scale up the ideas of inventors. Artisanal knowledge could progress on its own with cumulative incremental advances in productivity, but if it was to avoid running into diminishing returns, conceptual breakthroughs were required. Conversely, macroinventions depended crucially on the craftsmen that could turn new ideas from blueprints to functioning devices. Every James Watt required a set of brilliant artisans familiar with state of the art workmanship such as the ironmaster John Wilkinson and the engineer William Murdoch to carry out his plans.

As our analysis above makes clear, in our view the adoption of apprenticeship institutions that promoted the dissemination of knowledge, namely the guild and later on the market, lay at the heart of Western Europe's success.<sup>39</sup> Many of the guild arrangements supported the spread of technological knowledge beyond the boundaries of individual guilds, a critical factor in the diffusion of technology across the European continent.<sup>40</sup> Beyond the practice of tramping during the *Wanderjahre*, guilds also supplied waystations or *Herbergen* to host itinerant journeymen, who sometimes were lodged at the expense of the guild. Local artisans would interview these artisans, and sometimes hire them (Farr 2000, p. 212). Trained artisans were a mobile element in Europe. Some were highly mobile journeymen who moved across linguistic and national boundaries; others were permanent immigrants, lured by incentives or immigrants to new settlements. Technology diffused through Europe with skilled craftsmen in search of a livelihood. Given the localized nature of control guilds wielded, there seems to be no serious way they could have prevented this diffusion from happening (Reith 2008).

To shed further light on the role of apprenticeship institutions in the rise of European primacy, in this section we address two issues. First, we ask whether the theoretical mechanisms developed above could be sufficiently strong to account, in a quantitative sense, for the observed acceleration of European productivity growth relative to other world regions. We focus in particular on the comparison of Western Europe with the previous technological leader: China. Second, we consider mechanisms that may explain why Western Europe adopted superior apprenticeship institutions, while other world regions failed to do the same.

# 5.1 Accounting for Divergence in Productivity Growth Between Western Europe and China

In this section, we provide a quantitative assessment of the importance of apprenticeship institutions based on a parameterized version of the model economy. While the model is stylized, we still aim to choose parameter values that are realistic for the evidence from the period considered. For parameters where little evidence is available,

<sup>&</sup>lt;sup>39</sup>In reality, of course, the European economy in the pre-industrial era had examples of all four equilibria occurring simultaneously, since family equilibria were still common everywhere in Europe both in farming and in some high end occupations. In France, for instance, there is strong evidence of kinship-related apprentice relations in the baker's trade (Kaplan 1996, p. 193). Conversely, guilds of some kind were found in much of Eurasia including the *Sreni* of ancient India. But the fact remains that only (Western) Europe was characterized by the widespread adoption of a system build on exchange of knowledge outside of family lines.

<sup>&</sup>lt;sup>40</sup>Our theoretical analysis implicitly allows for such wide diffusion by assuming that guilds comprise *all* masters in a given trade, rather than being limited to specific cities or regions.

we choose conservative values so as not to exaggerate the importance of the role of apprenticeship institutions. One period (generation) is interpreted as 25 years. Consider first the aggregate technology. Voigtländer and Voth (2013b) argue that based on the historical evidence a land share in agricultural output of 40 percent is reasonable in the pre-industrial era. Given that the land share in manufacturing would be substantially lower, we choose an aggregate land share of  $\alpha = 1/3$ . The elasticity-of-substitution parameter  $\lambda$  determines the market power of guilds. While direct historical estimates of this parameter are not available, in modern studies this parameter is pinned down by observations on markups. To give a sizeable role to the anti-competitive aspect of guilds we set  $\lambda = 1.3$ , which would correspond to a markup of 30 percent, at the upper end of modern estimates. The shape parameter  $\theta$  determines the dispersion of craftsmen's productivity. Lucas (2009) sets this parameter to  $\theta = 0.5$  to match the dispersion in earnings observed in modern U.S. data. Given a lack of good inequality measures for the pre-industrial era, we use the same value. Notice that most available indicators suggest that inequality declined substantially between the industrialization period until a few decades ago, which suggests that inequality was likely to be higher in pre-industrial times and, hence, that  $\theta = 0.5$  is likely to be a conservative choice. For demographics, we set  $\bar{n} = 2$  and s = 7.5. These two parameters do not affect results, because the upper bound on fertility turns out not to be binding and (given the choice of a linear relationship between population growth and income per capita) the choice of s amounts to a choice of the units in which income is measured.<sup>41</sup>

Next, we turn to parameters that affect growth rates. In the family equilibrium, growth is driven by the relative efficiency of new ideas  $\nu$ . We set this parameter to reproduce a growth rate of population of 0.86 percent per generation in the family equilibrium, which matches the estimated growth of population between 10000 BCE and 1000 CE in Clark (2007), Table 7.1. This yields  $\nu=0.0086$ . In the clan equilibrium, growth is driven by the size of clans. Given the lack of hard information on this we use  $\sigma=6$ , a large value that implies that apprenticeship is possible even involving fairly distant relatives. For given remaining parameters, growth in the guild and market equilibria is jointly determined by altruism  $\gamma$ , the production of apprentices  $\kappa$ , and the cost of training apprentices  $\bar{\delta}$ . Our strategy is to preset two of these parameters ( $\gamma$  and  $\kappa$ ) and then use the third ( $\bar{\delta}$ ) to match specific targets. For altruism, we use  $\gamma=0.1$ , which corresponds to an annual discount factor of 0.91 (given a period/generation length of

 $<sup>^{41}</sup>$ That is, a different choice of s would result in a proportionally different level of income per capita in the balanced growth path, but implications for growth and apprenticeships would be identical.

25 years). For the output of apprentices we set  $\kappa = 0.02$ , which implies that in the family equilibrium, apprentices are about one-third as productive as adults.

For the training cost  $\bar{\delta}$ , we start by choosing this value such that that the number of masters per apprentice m is identical in the clan and guild equilibria, which yields  $\bar{\delta}=0.019$ . While this is not necessarily the most realistic value, equalizing m across the institutional regimes allows us to isolate the additional growth in the guild equilibrium, compared to the clan equilibrium, that arises solely out of the increased variety in masters' knowledge. Any growth effects due to a higher m in the guild would be in addition to this effect.

Table 1: Balanced Growth Paths for Different Apprenticeship Institutions in Parameterized Economy

Equilibrium	Number of Masters	Productivity Growth	Population Growth
Family <b>F</b>	1.00	0.29	0.86
Clan <b>C</b>	1.06	0.30	0.91
Guild $G$	1.06	2.14	6.43
Market <b>M</b>	1.08	2.87	8.60

**Notes:** One period corresponds 25 years. Growth rates are in percent per period. Number of masters is m; productivity growth is  $\theta(1-\alpha)(g-1)$ , where g is knowledge growth factor.

Table 1 displays the balanced growth rates for total factor productivity, given by  $k^{\theta(1-\alpha)}$ , and population N under each apprenticeship institution, together with the number of masters per apprentice, m. Notice that since income per adult is constant in the balanced growth path, the growth rate of total output Y is equal to the growth rate of population N. We find that productivity growth, population growth, and output growth are all increasing as we proceed from family to clan, guild, and ultimately the market. In terms of the growth performance of the different institutional regimes, we notice that the growth advantage of the clan compared to the family is small, with a productivity growth rate of close to 0.3 percent in either case. In contrast, the guild yields substantially a higher growth rate (above 2 percent per generation) than either family or clan. The guild yields substantially higher growth than the clan even though (given our parametrization) the number of masters per apprentice is exactly the same; it is the higher efficiency of knowledge transmission in a system unconstrained by bloodlines rather than more learning opportunities that explains the advantage of the guild. Moving from guild to market

yields an additional growth effect through a higher m (because in the market system, guilds are not able to restrict access to apprenticeship). The variation in m between the apprenticeship institutions is fairly small in our example (from 1 in the family to 1.08 in the market).<sup>42</sup>

In the results displayed in Table 1, the training cost  $\delta$  was chosen such that the number of masters is equated between clan and guild, which is useful for highlighting the mechanism, but not necessarily empirically realistic. Next, we ask whether the mechanism could quantitatively account for the empirically observed acceleration in growth in Western Europe relative to other world regions after Europe adopted the guild equilibrium. In matching the model to long-run growth data we confront two difficulties. First, given the distant time periods involved there is a lot of uncertainty about exactly what income and population levels were. We use Maddison (2010) as our baseline data source, but also explore robustness to using alternative statistics from Broadberry, Guan, and Li (2014). Second, predictions for population growth and income levels depend not just on productivity growth (which our model focuses on) but also on the Malthusian link between income per capita and population growth (which is a linear relationship in our model for analytical convenience). Mapping the model predictions into data for both population or income per capita is especially difficult if the income-population link shifts over time, which the evidence suggests is relevant for China and Europe in this period.<sup>43</sup> We deal with this issue by focusing directly on productivity. Specifically, we use the available data on population and income levels in China and Western Europe to do a growth accounting exercise and back out productivity growth. Then, we show what it would take for the model to account for the observed differences in productivity growth.44

The underlying data and the details of the productivity calculations are described in Apprendix J. The growth accounting exercise brings out the main facts that motivate the study, namely a rise in productivity growth in Europe but not China after the year 1000. Using data from Maddison (2010) on total population and GDP per capita in

 $<sup>^{42}</sup>$ In the model, we treat m as a continuous variable. A value of m of, say, 1.1 should be interpreted to correspond to a situation in the data where most apprentices learn from a single master, and only about one in ten apprentices benefit from multiple learning opportunities.

<sup>&</sup>lt;sup>43</sup>See, e.g., Voigtländer and Voth (2013b, 2013a) on demographic changes in Europe after the Black Death.

<sup>&</sup>lt;sup>44</sup>To match the data for both income and population, it would be necessary to include a more flexible income-population link in the model and let this vary over time. This is in principle straightforward to do, but also orthogonal to our focus on the implications of apprenticeship institutions for productivity growth, and hence we do not include such an extension here.

Western Europe and China, we find that in the period from 1 to 1000, China led Western Europe in total factor productivity growth by 0.9 percent per generation (25 years). Subsequently, productivity growth accelerated substantially in Western Europe, resulting in a gap between the productivity growth rate of Western Europe compared to China of about 2.5 percent per generation from 1000 to 1820, right at the onset of the Industrial Revolution. Using instead Broadberry, Guan, and Li (2014) for historical estimates of income per capita leads to similar conclusions for Western Europe, but a more pessimistic view of productivity growth in China after 1000 (due to higher estimates of GDP per capita early on). Consequently, the estimated gap in productivity growth between Western Europe and China is even larger, amounting to 4.8 percent per generation from 1000 to 1500, and 7.4 percent from 1500 to 1820.

Table 2: Accounting for Observed Differences in Productivity Growth Between Western Europe and China

		Model Variables to Match Gap		
Period	Gap in TFP Growth	Training Cost	Number of Masters	
1000-1500	2.5 (Maddison 2010)	0.016	1.15	
1000-1500	4.8 (Broadberry et al. 2014)	0.013	1.29	
1500-1850	2.4 (Maddison 2010)	0.018	1.07	
1500–1850	7.4 (Broadberry et al. 2014)	0.014	1.22	

**Notes:** TFP growth is in percent per period (25 years). Details on computation of TFP growth in the data are given in Apprendix J. The training cost displayed is the parameter  $\bar{\delta}$  that matches the observed gap in TFP growth between an economy that is continuously in the clan equilibrium (as displayed in Table 1) and an economy that starts out in the family equilibrium and then is in the guild equilibrium from 1250 onwards. The number of masters is the m in the guild equilibrium corresponding to the displayed training cost.

From the perspective of our model, we interpret the gap in productivity growth between Western Europe and China as being due to a transition of Western Europe from the family to the guild equilibrium, whereas China remains in the clan equilibrium throughout. To assess whether this mechanism could possibly explain the data, Table 2 displays the values of the training cost of apprentices  $\bar{\delta}$  and the corresponding equilibrium number of masters per apprentice m in the guild equilibrium that would need to be imposed to match the observed gap in productivity growth in each period (recall that  $\bar{\delta}$  affects the balanced growth path in the guild equilibrium but not the clan equilibrium, where

instead apprenticeship is limited by the size of the clan).<sup>45</sup> The switch to the guild equilibrium is assumed to occur in 1250, so that Western Europe spends half of the period 1000–1500 and all of the period 1500–1820 in the guild equilibrium.

The results in Table 2 show that the observed gap in productivity growth can be matched with training costs that still imply a low number of masters per apprentice. For matching Maddison (2010), the number of masters in the guild equilibrium is 1.15 for the first period and only 1.07 for the second period. If we fix the training cost at the level estimated based on the first period 1000–1500, the model actually over-predicts the gap in productivity growth between Western Europe and China in 1500–1820. One possible interpretation is that our assumption that the Western Europe remained in the family equilibrium until 1250 is too pessimistic. Given the larger implied growth differential, matching the Broadberry, Guan, and Li (2014) numbers requires a lower training cost and implies a larger number of masters per apprentice, but even here the number of masters remains low, implying that only a minority of apprentices had multiple training opportunities.

Clearly, it is not possible to quantify the relative importance of apprenticeship institutions for explaining the pre-industrial rise in productivity growth in Western Europe with great precision: there is considerable uncertainty about the historical statistics, we lack direct historical measures for key statistics such as the number of masters per apprentice and the dispersion in craftsmen's productivity, and we also lack precisely quantified measures of other sources of productivity growth (such as scientific breakthroughs and improvements in agriculture). Still, the results here do suggest that the mechanism has at least the potential to explain a substantial fraction of the rise of European productivity.

### 5.2 Endogenous Transitions between Apprenticeship Institutions

In the quantitative assessment above, we took the transition of Europe from the family to the clan equilibrium as well as the continued prevalence of the clan equilibrium in

<sup>&</sup>lt;sup>45</sup>The numbers for productivity growth in Table 2 are based on the balanced growth rate for each apprenticeship institution. However, the model displays little transitional dynamics in terms of productivity growth, so that computations based on dynamic transition paths lead to virtually the same results.

<sup>&</sup>lt;sup>46</sup>Regarding the role of agricultural productivity, we argue in Appendix J that even though reliable measures of sector-level differences in productivity growth between Western Europe and other regions do not exist, the evidence suggest that improvements in artisanal productivity are likely to account for the largest portion of gap.

China as given. We now consider mechanisms that could explain *why* the two regions adopted different institutions.

The importance of clans in China has recently been emphasized in the work of Avner Greif with different coauthors (e.g., Greif and Tabellini 2010, Greif, Iyigun, and Sasson 2012, Greif and Iyigun 2013, and Greif and Tabellini 2017). "[In China] clans relieved the poor, the elders and the orphans, lent money to members in need, educated the young, conducted religious services, built bridges, constructed dams, reclaimed land, protected property rights, and administered justice (Greif and Tabellini 2017, p. 8)" The importance of clans and kinship relations in Chinese economic history was far larger than in Europe, where society was organized along nuclear families. A More generally, Kumar and Matsusaka (2009) report an array of historical evidence documenting the preindustrial importance of kinship networks in China, India, and the Islamic world. In contrast to the rest of the world, in Europe the nuclear family came to dominate (corresponding to the family equilibrium in our model).

It is clear that by the High Middle Ages, extended families (or what we might call "clans") had largely disappeared in Europe, and especially in the Western part (Shorter 1975, p. 284; Mitterauer 2010, p. 72). Peter Laslett, who has done more than anyone to establish this view, referred to the typical European family as the conjugal family unit, couple plus offspring (Laslett and Wall 1972). When, and even more so why, this pattern became so dominant in Europe remains to this day a debated question. <sup>48</sup> To some extent it may have been encouraged by policies of the Western Christian church, as Greif and Tabellini argue. In Europe the Christian church actively discouraged practices that sustained kinship groups. The existence of institutions that encouraged the cooperation among non-kin, such as manors and monasteries, may have been equally important. By the early Middle Ages the nuclear family already dominated in some areas. <sup>49</sup>

<sup>&</sup>lt;sup>47</sup>In his recent summary, Von Glahn (2016) remarks that "the salient place of social networks and kinship institutions such as lineage trusts in Chinese business often has been regarded as favoring a 'patronage economy' that hindered the development of impersonal, professional management" (p. 396). Similarly, in her recent study of the clan records as a source of historical information, Shiue (2016) notes that Chinese lineage organization was quite different from Western forms of social organization and stresses the Confucian principle of kinship as the organizing principle of human relationships (p. 462). The importance of kinship and lineage in the enforcement of other contracts is illustrated in Zelin and Gardella (2004).

<sup>&</sup>lt;sup>48</sup>The dominance of the nuclear family went together with the enforcement of strict monogamy, when it became infeasible for men to simultaneously father children from multiple women, and remarriage was only possible after widowhood, see de la Croix and Mariani (2015).

<sup>&</sup>lt;sup>49</sup>Mitterauer (2010) describes two signs of the emergence of the nuclear family: the distinction between paternal and maternal relatives disappeared from the Romance languages by 600 CE (and from other

Why did (nuclear) family-based Europe adopt better institutions over time, while clanbased regions did not? One potential explanation is that it is precisely Europe's starting point in the low-growth family equilibrium that fostered the more rapid adoption of superior institutions. If adopting the guild or market systems is costly, the incentive for adoption depends on the the performance of the existing institutions. In our view, other world regions had less to gain from adopting new institutions, given that the clanbased system performed well for most purposes. Moreover, Europe was the only place in which the idea of a "corporation" took root—a rule-setting non-state organization of people united by common interest and occupation, not blood ties. Guilds were only one example of such corporation, monasteries and universities were in that regard quite similar. In many places, guilds formed an alliance with the crown and were even known as *choses du roi* in France, yet formally they remained autonomous. In the absence of the legal concept of such corporations, it is not clear that craft guilds of the type that developed in Europe were ever a realistic option elsewhere, except when they coincided with family ties.

To formalize this possibility, consider the option of adopting the guild system at fixed per-family cost of  $\mu(N)$ . We let this cost depend on the density of population, with  $\mu'(N) < 0$  reflecting the idea that the adoption of guilds is cheaper when density is high (in line with the fact that the incidence of guilds increases with population density, see De Munck, Lourens, and Lucassen 2006). This cost  $\mu(N)$  can either be seen either as an aggregate cost of setting up guilds or courts, or linked to an individual decision, i.e., the cost of moving from a small town to a larger city where contract enforcement institutions are in place.

Formally, we need to compare the utility of the parents from keeping the current system,  $u^{\text{F} \to \text{F}}$  and  $u^{\text{C} \to \text{C}}$  with the one of adopting the guild based apprenticeship,  $u^{\text{F} \to \text{G}}$  and  $u^{\text{C} \to \text{G}}$ . Let us consider two economies having the same population  $N_0$  and knowledge  $k_0$ , one in the family system, the other in the clan system. The distribution of income is thus the same in these two economies, as is mean income  $y_0$  and the number of children  $n_0$ . Adults have to decide whether to pay the cost  $\mu$  to adopt the guild. If the guild is adopted, the equilibrium price of apprenticeship will be  $p_0$ , the number of apprentices per master will be  $a_0$ , and the number of masters teaching one apprentice will be  $m_0$ . The income of the children under the guild system will be given by:  $y^{\text{F} \to \text{G}} = y^{\text{C} \to \text{G}} \equiv y_1^{\text{G}}$ .

European languages soon after); and spiritual kinships analogous to blood kinships were established (such as godmother and godfather).

Let us now write the utility in the four cases:

$$u^{\text{F} \to \text{F}} = y_0 + \gamma \, n_0 \, y_1^{\text{F}} + \kappa \, n_0 - \delta(n_0)$$

$$u^{\text{F} \to \text{G}} = y_0 + \gamma \, n_0 \, y_1^{\text{G}} + \kappa \, a_0 - \delta(a_0) - \mu(N_0)$$

$$u^{\text{C} \to \text{C}} = y_0 + \gamma \, n_0 \, y_1^{\text{C}} + \kappa \, (n_0)^{o+1} - \delta((n_0)^{o+1})$$

$$u^{\text{C} \to \text{G}} = y_0 + \gamma \, n_0 \, y_1^{\text{G}} + \kappa \, a_0 - \delta(a_0) - \mu(N_0)$$

The following propositions gives the main result.

### Proposition 6 (Transition from Family and Clan to Guild).

Consider two economies with the same initial knowledge and population, one in the family equilibrium, and one in the clan equilibrium. If  $\lim_{N\to 0} \mu(N) = \infty$  and  $\lim_{N\to \infty} \mu(N) = 0$ , there exist population thresholds  $\underline{N}$  and  $\overline{N}$ , with  $\underline{N} < \overline{N}$ , such that:

- $\triangleright$  if  $N_0 < \underline{N}$ , none of the economies adopt the guild institution.
- $\triangleright$  if  $\underline{N} \leq N_0 \leq \overline{N}$ , only the economy in the family equilibrium adopts the guild institution.
- $\triangleright$  if  $\overline{N} < N_0$ , both economies adopt the guild institution.

# **Proof.** See Appendix I.

Given equal populations, the incentive to pay the fixed cost will be lower when the initial economic system is more successful, i.e., a clan-based economy will be less likely to adopt than a family-based economy.<sup>50</sup>

Take now two hypothetical economies starting with the same low level of population. Suppose that one of them starts in the family equilibrium, whereas in the other the clan equilibrium prevails. In both economies, population is low and the guild equilibrium is not adopted, but there is still some technical progress and population grows. Given Proposition 3, population growth is higher in the clan economy. The question is which economy will first reach the population threshold that makes adopting the market optimal. The family economy has a lower threshold value, but, as it grows more slowly, it is not clear that it will adopt the guild first. A possible trajectory is the one shown in Figure 5. Here, the family economy adopts the guild earlier, at date  $t_1$ , which allows it to catch up and overtake the clan economy.

<sup>&</sup>lt;sup>50</sup>This explanation applies earlier work by Avner Greif (see in particular Greif 1993 and Greif 1994) on institutional change to the issue of human capital and knowledge transmission.

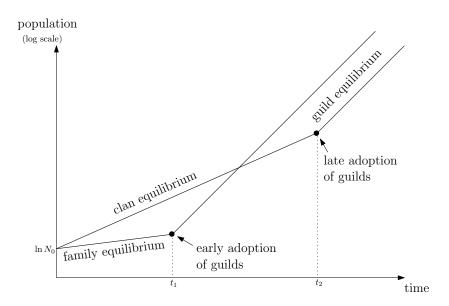


Figure 5: Possible Dynamics of Two Economies Starting from the Same  $N_0$ 

Later on, the clan economy may or may not reach its own threshold above which it is optimal to adopt the guild, depending on the properties of the cost function  $\mu(\cdot)$ , and in particular how it behaves when population becomes large. If  $\lim_{N\to\infty}\mu(N)=0$ , the guild will be adopted for sure (which is the case covered in Proposition 6). But if  $\lim_{N\to\infty}\mu(N)>0$  (which is the case, for instance, if the total cost of setting up guilds includes a fixed cost per family), the economy may stay permanently in the clan equilibrium. The case displayed in the picture is where the economy that starts out in the clan equilibrium reaches the threshold at some later date  $t_2$ .

# Proposition 7 (Clan as an Absorbing State).

If

$$\lim_{N \to \infty} \mu(N) > \gamma n^{c} (y_{1}^{G} - y^{c}) + \kappa (a_{1}^{G} - (n^{c})^{o+1}) - \delta(a_{1}^{G}) + \delta((n^{c})^{o+1}),$$

the economy in the clan equilibrium never adopts the guild.

Here the values of  $n^c$  and  $y^c$  are defined in Proposition 3, and  $y_1^c$ ,  $a_1^c$  are values from the guild equilibrium after one period, starting from the clan balanced growth path as the initial condition. The proposition holds because, in a Malthusian context, income per person  $y^c$  and  $y_1^c$  remains bounded.

### 5.3 Complementary Mechanisms

In reality, complementary mechanisms are likely to have also contributed to the failure of clan-based economies to adopt more efficient apprenticeship institutions. The clan-based organization had many advantages over the family other than faster knowledge growth; indeed, most economic and social life was organized around the clan. One specific aspect was that the clan adhered to what Greif and Tabellini call "limited morality"—a loyalty to kin but not to others. Such institutions have obvious attractions, such as an advantage in intra-group cooperation, the supply of public goods, and mutual insurance. But they have a comparative disadvantage in sustaining broader intergroup cooperation. In terms of economic efficiency, the two arrangements of family and clan therefore have clear tradeoffs. The clan economizes on enforcement costs, but at the cost of economies of scale and pluralism. The bottom line is that for a successful clan-based economy, the cost of giving up the existing system of social organization (in favor of the guild system) is likely to have been much higher than what our stylized model suggests.

Another dimension is that the dominance of the nuclear family in Europe created a need early on for organizations that cut across family lines. Guilds were independent of families, but they had many antecedents that had a similar legal status (such as monasteries, universities or independent cities). Hence, earlier institutional developments may have made the adoption of guilds in Europe much cheaper compared to clan-based societies.

Still other factors also may have been at work in specific regions. A striking difference between China and Europe before the Industrial Revolution is in settlement patterns. China was, as Greif and Tabellini point out, a land of clans, but much less than Europe a land of cities. As Rosenthal and Wong (2011, p. 113) stress, Chinese manufacturing was much less concentrated in cities than it was in Europe—a difference they attribute to the dissimilar warfare patterns. In China the main threat came not from one's neighbors but from invading nomads from the steppe; hence the need for a Great Wall. Cities were walled to some extent, but walled cities were far fewer than in Europe, and the walls served more as symbols than as protection from attack. As much as 97 percent of the Chinese population lived outside the walled cities. This difference in urbanization is an important clue to why European institutions evolved in a different way. If the cost of adopting guilds depends on population density, the "effective" population density would have been much higher in Europe, because craftsmen were concentrated in small

urban areas. In the model above, that difference would be represented as a lower level of the cost function  $\mu(N)$  for a given overall population.

In our analysis of institutional transitions, we focus on the introduction of apprenticeships and guilds in Western Europe. An important topic for future research is to consider also the ensuing transition from guild to market, which results in even more rapid growth. If we are comparing Europe with the world of clans, we must note that allpowerful guilds were not ubiquitous in Europe, and that by the middle of the seventeenth century craft guilds were declining in many areas. In the Netherlands, in England, and even to some extent in France, the power of guilds to impose restrictions on entry and to control product markets faded in the eighteenth century. It was then that "free trade" regions (i.e., exempted from guild control) emerged, such as the famous one in the Faubourg St. Antoine near Paris (Horn 2015, pp. 1–3). In other words, not only did Europe adopt guilds, a superior set of institutions for transmitting skills relative to clans, but also, Europe was in transit to a market system which was even better at it. In nineteenth-century Britain, apprenticeship persisted despite the abolition of the 1563 Statute of Artificers in 1814. It did so because even in an age of mass schooling, the transmission of tacit technical knowledge through personal contact remained a critical part of skills transmission. In the United States, however, the absence of a tradition and high mobility made third party enforcement of apprenticeship contracts impracticable and the "market for apprenticeship" virtually disappeared (Elbaum 1989; Elbaum and Singh 1995).

Notice that the explanation for the earlier adoption of guilds in Europe formulated in Proposition 6, namely that for a given cost of adopting the new institution the benefits are higher if the initial condition is worse, cannot explain why Europe was also first to adopt the market system. Indeed, once Europe adopts the guild it has a better initial condition compared to clan-based economies, which based solely on this argument should lead to a slower adoption of an even better institution. Instead, this transition can be understood in terms of a lower cost of adopting the market once the guild is already in place. The market is closely related to the guild; both systems are based on impersonal institution such as the corporations discussed above, so that once the guild system is established, moving to the market is a small step compared to jumping all the way from clan to market. More generally, the market system (and the guild, albeit to a lesser extent) relies on well defined and enforced property rights, and hence sufficient state capacity. The rise of the market equilibrium for apprenticeship therefore depends

on, and is complementary to, wider changes in the economic and political organization of society that occurred at the same time. Conversely, the benefits that the clan system conferred beyond its narrow economic implications also may have contributed to a relatively higher cost of adopting the market.

### 6 Conclusion

In this paper, we have examined sources of productivity growth in pre-industrial societies, in order to explain the economic ascendency of Western Europe in the centuries leading up to industrialization. We developed a model of person-to-person exchanges of ideas, and argued that apprenticeship institutions that regulate the transmission of tacit knowledge between generations are key for understanding the performance of pre-industrial economies.

In our analysis, we have put the spotlight on differences across institutions in the dissemination of knowledge. Of course, a second channel of productivity growth is innovation, i.e., the creation of entirely new knowledge. Our analysis does allow for innovation in the form of new ideas, but we have held this aspect of productivity growth constant across institutions. A natural extension of our work would be to examine how the institutional differences we identify here as driving differences in the dissemination of knowledge may affect incentives for original innovation. The importance of highly skilled craftsmen for the innovative activities that led to the Industrial Revolution has become an important theme in the industrialization literature. Indeed, some scholars such as Hilaire-Pérez (2007) and Epstein (2013) have argued that rising artisanal skill levels and the high level of innovation among the most sophisticated craftsmen alone could have fostered the Industrial Revolution. While such an extreme view slights the contribution of codifiable knowledge and formal science, there is no question that high-ability artisans were a pivotal element in the rise of modern technology, and that Britain's leadership rested to a great extent on the advantage it had in skilled workers (Kelly, Mokyr, and O Gráda 2014). Advances were made by a literate and educated elite, the classic example of upper-tail human capital (de la Croix and Licandro 2015, and Squicciarini and Voigtländer 2015). Increasing longevity, moreover, in the mid-seventeenth century may have stimulated further investment in the human capital of this elite and facilitated the diffusion of their knowledge. Yet, just as importantly, these highly educated people interacted with the most skilled and dexterous craftsmen (Meisenzahl and Mokyr 2012). A powerful example of this complementarity is the British watch industry in the eighteenth century. Watchmaking was a high-level skill, originally regulated by a guild (the Worshipful Company of Clockmakers, one of the original livery companies of the City of London) but by 1700 more or less free of guild restrictions. Training occurred exclusively through master-apprentice relations. In the seventeenth century, the industry experienced a major technological shock by the invention of the spiral-spring balance in watches by two of the best minds of the seventeenth century, Christiaan Huygens and Robert Hooke (ca. 1675). No similar macro-invention occurred over the subsequent century, yet the real price of watches fell by an average of 1.3 percent a year between 1685 and 1810 (Kelly and Ó Gráda 2016). As Kelly and Ó Gráda note, "Once this conceptual breakthrough occurred, England's extensive tradition of metal working and the relative absence of restrictions on hiring apprentices, along with an extensive market of affluent consumers, allowed its watch industry to expand rapidly"(p. 5). An eighteenth century observer noted that for watchmaking an apprentice needed at least 14 years (or fewer if he was "tolerably acute") and that to be truly skilled he needed to learn a "smattering of mechanics and mathematics"—presumably skills that were taught by the master (Campbell 1747, p. 252).

Another issue is the interaction of the acquisition of tacit knowledge through apprenticeship with formal education after the rise of mass schooling in the nineteenth and early twentieth century. A key question here is whether apprenticeship and formal schooling should be viewed as complements or substitutes. One may conjecture that the more general knowledge provided by formal schooling was more appropriate and flexible in a time when technological change made entire crafts and occupations obsolete, and workers had to be prepared to move across multiple fields and occupations over their careers. If this factor was important, widespread apprenticeship could be viewed as a handicap that slowed down the transition to mass schooling necessary for modern growth. But it is also possible that tacit and formal knowledge complemented each other. To the present day, Germany has a system of "dual education" that combines apprenticeship with formal education in state schools. The system is generally viewed as an important contributor to German economic success, resulting (among other things) in much lower youth unemployment that other European countries. At the same time, Germany also has substantially lower participation in tertiary education than the United States. There may be some role for forms of apprenticeship even at the highest level of education. Graduate school in economics, for example, combines formal education with forms of apprenticeship (i.e., graduate students working as research assistants). We leave for

future research an exploration of the various complementarities between the creation and dissemination of tacit and formal knowledge within a model of person-to-person exchanges of ideas.

#### References

- Aghion, Philippe, and Peter Howitt. 1992. "A Model of Growth through Creative Destruction." *Econometrica* 60 (2): 323–51.
- Alvarez, Fernando E., Francisco J. Buera, and Robert E. Lucas, Jr. 2008. "Models of Idea Flows." NBER Working Paper 14135.
- ——. 2013. "Idea Flows, Economic Growth, and Trade." NBER Working Paper 19667.
- Ashraf, Quamrul, and Oded Galor. 2011. "Dynamics and Stagnation in the Malthusian Epoch." *American Economic Review* 101 (5): 2003–41.
- Barro, Robert J., and Gary S. Becker. 1989. "Fertility Choice in a Model of Economic Growth." *Econometrica* 57 (2): 481–501.
- Belfanti, Carlo Marco. 2004. "Guilds, Patents, and the Circulation of Technical Knowledge." *Technology and Culture* 45 (3): 569–89.
- Bellavitis, Anna, Riccardo Cella, and Giovanni Colavizza. 2016. "Apprenticeship in Early Modern Venice." Presented to the Workshop "Apprenticeship in the Western World," Utrecht.
- Ben Zeev, Nadav, Joel Mokyr, and Karine Van Der Beek. 2017. "Flexible Supply of Apprenticeship in the British Industrial Revolution." Forthcoming, Journal of Economic History.
- Broadberry, Stephen. 2015. "Accounting for the Great Divergence." Unpublished Manuscript, Nuffield College.
- Broadberry, Stephen, Hanhui Guan, and David D Li. 2014. "China, Europe and the Great Divergence: A Study in Historical National Accounting, 980-1850." Economic History Department Paper, London School of Economics.
- Brooks, Christopher. 1994. "Apprenticeship, Social Mobility and the Middling Sort, 1550–1800." In *The Middling Sort of People: Culture, Society and Politics in England, 1550-1800*, edited by Jonathan Barry and Christopher Brooks, 52–83. London: Palgrave Macmillan.
- Brown, Shannon R. 1979. "The Ewo Filature: a Study in the Transfer of Technology to China." *Technology and Culture* 20:550–568.
- Burgess, John Stewart. 1928. The Guilds of Peking. New York: Columbia University Press.
- Campbell, R. 1747. The London Tradesman. London: Printed by T. Gardner.
- Clark, Gregory. 2007. A Farewell to Alms: A Brief Economic History of the World. Princeton: Princeton University Press.

- Cowan, Robin, and Dominique Foray. 1997. "The Economics of Codification and the Diffusion of Knowledge." *Industrial and Corporate Change* 6 (3): 595–622.
- Crowston, Clare, and Clare Lemercier. 2016. "From Apprentice to Master: Guild/Post-guild Relationships and the Lessons of the Life Course." Presented to the Workshop Apprentice-ship in the Western World, Utrecht.
- Davids, Karel. 2003. "Guilds, Guildmen and Technological Innovation in Early Modern Europe: The Case of the Dutch Republic." Economy and Society in the Low Countries Working Papers, No. 2.
- ——. 2007. "Apprenticeship and Guild Control in the Netherlands, c. 1450-1800." In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Steven L. Kaplan Bert De Munck and Hugo Soly, 65–84. New York: Berghahn Books.
- ———. 2013. "Moving Machine-makers: Circulation of Knowledge on Machine-building in China and Europe between c. 1400 and the Early Nineteenth Century." Chapter 6 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan L. van Zanden and Marten Prak. Boston: Brill.
- Davies, Margaret Gay. 1956. The Enforcement of English Apprenticeship: a Study in Applied Mercantilism, 1563-1642. Cambridge, MA: Harvard University Press.
- de la Croix, David, and Matthias Doepke. 2003. "Inequality and Growth: Why Differential Fertility Matters." *American Economic Review* 93 (4): 1091–113.
- de la Croix, David, and Omar Licandro. 2015. "The Longevity of Famous People from Hammurabi to Einstein." *Journal of Economic Growth* 20 (3): 263–303.
- de la Croix, David, and Fabio Mariani. 2015. "From Polygyny to Serial Monogamy: A Unified Theory of Marriage Institutions." *Review of Economic Studies* 82 (2): 565–607.
- De Munck, B.Bert, Piet Lourens, and Jan Lucassen. 2006. "The Establishement and Distribution of Crafts Guilds in the Low Countries 1000-1800." Chapter 2 of *Crafts Guilds in the Early Modern Low Countries: Work, Power and Representation*, edited by Maarten Prak, Catharina Lis, Jan Lucassen, and Hugo Soly. Aldershot: Ashgate.
- De Munck, Bert, and Hugo Soly. 2007. "Learning on the Shop Floor in Historical Perspective." In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Steven L. Kaplan Bert De Munck and Hugo Soly, 3–32. New York: Berghahn Books.
- Desmet, Klaus, and Stephen L. Parente. 2014. "Resistance to Technology Adoption: The Rise and Decline of Guilds." *Review of Economic Dynamics* 17 (3): 437–58.
- Dittmar, Jeremiah E. 2011. "Information Technology and Economic Change: The Impact of The Printing Press." *Quarterly Journal of Economics* 126 (3): 1133–1172.

- Doepke, Matthias. 2004. "Accounting for Fertility Decline During the Transition to Growth." *Journal of Economic Growth* 9 (3): 347–83.
- Dunlop, O. Jocelyn. 1911. "Some Aspects of Early English Apprenticeship." *Transactions of the Royal Historical Society, Third Series* 5:193–208.
- ——. 1912. English Apprenticeship and Child Labor. New York: MacMillan.
- Eaton, Jonathan, and Samuel Kortum. 1999. "International Technology Diffusion: Theory and Measurement." *International Economic Review* 40 (3): 537–70.
- Elbaum, Bernard. 1989. "Why Apprenticeship Persisted in Britain But Not in the United States." *Journal of Economic History* 49 (2): 337–349.
- Elbaum, Bernard, and Nirvikar Singh. 1995. "The Economic Rationale of Apprenticeship Training: Some Lessons from British and U.S. Experience." *Industrial Relations: A Journal of Economy and Society* 34 (4): 593–622.
- Epstein, Stephan R. 2008. "Craft Guilds, the Theory of the Firm, and the European Economy, 1400–1800." In *Guilds, Innovation and the European Economy*, 1400-1800, edited by Stephan R. Epstein and Maarten Prak, 52–80. Cambridge: Cambridge University Press.
- Epstein, Stephan R. 2013. "Transferring Technical Knowledge and Innovating in Europe, c. 1200–c. 1800." Chapter 1 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan L. van Zanden and Marten Prak. Boston: Brill.
- Epstein, Stephan R., and Maarten Prak. 2008. "Introduction: Guilds, Innovation and the European Economy, 1400–1800." In *Guilds, Innovation and the European Economy,* 1400-1800, edited by Stephan R. Epstein and Maarten Prak, 1–24. Cambridge: Cambridge University Press.
- Faroqhi, Suraiya. 2009. *Artisans of Empire: Crafts and Craftspeople under the Ottomans*. New York: I.B. Taurus.
- Farr, James. 2000. Artisans in Europe, 1300–1914. Cambridge: Cambridge University Press.
- Fogli, Alessandra, and Laura Veldkamp. 2012. "Germs, Social Networks and Growth." NBER Working Paper 18470.
- Foray, Dominique. 2004. The Economics of Knowledge. Cambridge, MA: MIT Press.
- Galor, Oded. 2011. Unified Growth Theory. Princeton: Princeton University Press.
- Galor, Oded, and David N. Weil. 2000. "Population, Technology, and Growth: From Malthusian Stagnation to the Demographic Transition and Beyond." *American Economic Review* 90 (4): 806–28.
- Gowlland, Geoffrey. 2012. "Learning Craft Skills in China: Apprenticeship and Social Capital in an Artisan Community of Practice." *Anthropology & Education Quarterly* 43 (4): 358–371.

- Greif, Avner. 1993. "Contract Enforceability and Economic Institutions in Early Trade: The Maghribi Traders' Coalition." *American Economic Review* 83 (3): 525–48.
- ——. 1994. "Cultural Beliefs and the Organization of Society: A Historical and Theoretical Reflection on Collectivist and Individualist Societies." *Journal of Political Economy* 102 (5): 912–50.
- ——. 2006. "Family Structure, Institutions, and Growth: The Origins and Implications of Western Corporations." *American Economic Review* 96 (2): 308–312.
- Greif, Avner, and Murat Iyigun. 2013. "Social Organizations, Violence, and Modern Growth." American Economic Review 103 (3): 534–38.
- Greif, Avner, Murat Iyigun, and Diego Sasson. 2012. "Social Institutions and Economic Growth: Why England and Not China Became the First Modern Economy." Unpublished Working Paper, University of Colorado.
- Greif, Avner, and Guido Tabellini. 2010. "Cultural and Institutional Bifurcation: China and Europe Compared." *American Economic Review* 100 (2): 135–40.
- ———. 2017. "The Clan and the Corporation: Sustaining Cooperation in China and Europe." Forthcoming, Journal of Comparative Economics.
- Hajnal, John. 1982. "Two Kinds of Preindustrial Household Formation System." *Population and Development Review*, pp. 449–94.
- Hilaire-Pérez, Liliane. 2007. "Technology as a Public Culture in the XVIIIth Century: The Artisans' Legacy." *History of Science* 45 (2): 135–153.
- Horn, Jeff. 2015. *Economic Development in Early Modern France*. Cambridge: Cambridge University Press.
- Humphries, Jane. 2003. "English Apprenticeship: A Neglected Factor in the First Industrial Revolution." Chapter 3 of *The Economic Future in Historical Perspective*, edited by Paul A. David and Mark Thomas. Oxford: Oxford University Press.
- . 2010. *Childhood and Child Labour in the British Industrial Revolution*. Cambridge Studies in Economic History Second Series. Cambridge: Cambridge University Press.
- Islam, Md. Nazrul. 2016. "Integrating Chinese Medicine in Public Health: Contemporary Trend and Challenges." In *Public Health Challenges in Contemporary China- An Interdisciplinary Perspective*, edited by Md. Nazrul Islam, 55–72. Berlin: Springer.
- Jones, Charles I. 2001. "Was an Industrial Revolution Inevitable? Economic Growth Over the Very Long Run." *B.E. Journal of Macroeconomics* 1 (2): 1–45.
- Jovanovic, Boyan. 2014. "Misallocation and Growth." *American Economic Review* 104 (4): 1149–1171.

- Jovanovic, Boyan, and Rafael Rob. 1989. "The Growth and Diffusion of Knowledge." *Review of Economic Studies* 56 (4): 569–82.
- Kaplan, Steven L. 1981. "The Luxury Guilds in Paris in the Eighteenth Century." *Francia* 9:257–98.
- ———. 1996. *The Bakers of Paris and the Bread Question*. Durham and London: Duke University Press.
- Kelly, Morgan, Joel Mokyr, and Cormac Ó Gráda. 2014. "Precocious Albion: A New Interpretation of the British Industrial Revolution." *Annual Review of Economics* 6:363–389.
- Kelly, Morgan, and Cormac Ó Gráda. 2012. "The Preventive Check in Medieval and Preindustrial England." *Journal of Economic History* 72 (04): 1015–1035.
- ———. 2014. "Living Standards and Mortality Since the Middle Ages." *Economic History Review* 67 (2): 358–381.
- ———. 2016. "Adam Smith, Watch Prices, and the Industrial Revolution." *Quarterly Journal of Economics* 131 (4): 1727–1752.
- König, Michael, Jan Lorenz, and Fabrizio Zilibotti. 2016. "Innovation vs. Imitation and the Evolution of Productivity Distributions." *Theoretical Economics* 11 (3): 1053–1102.
- Kortum, Samuel S. 1997. "Research, Patenting, and Technological Change." *Econometrica* 65 (6): 1389–419.
- Kremer, Michael. 1993. "Population Growth and Technological Change: One Million B.C. to 1900." *Quarterly Journal of Economics* 108 (3): 681–716.
- Kumar, Krishna B., and John G. Matsusaka. 2009. "From Families to Formal Contracts: An Approach to Development." *Journal of Development Economics* 90 (1): 106–119.
- Lane, Joan. 1996. Apprenticeship in England 1600–1914. Boulder: Westview Press.
- Laslett, Peter, and Richard Wall, eds. 1972. *Household and Family in Past Time*. Cambridge: Cambridge University Press.
- Leeson, Robert. 1979. *Travelling Brothers: Six Centuries Road from Craft Fellowship to Trade Unionism*. London: George Allen & Unwin.
- Leunig, Tim, Chris Minns, and Patrick Wallis. 2011. "Networks in the Premodern Economy: The Market for London Apprenticeships, 1600-1749." *Journal of Economic History* 71:413–443.
- Lis, Catharina, Hugo Soly, and Lee Mitzman. 1994. "'An Irresistible Phalanx:' Journeymen Associations in Western Europe, 1300-1800." *International Review of Social History* 39:11–52.
- Long, Pamela O. 2011. *Artisan/Practitioners and the Rise of the New Sciences*, 1400–1600. Cornvallis: Oregon State University Press.

- Lucas, Jr., Robert E. 2009. "Ideas and Growth." Economica 76 (301): 1–19.
- Lucas, Jr., Robert E., and Benjamin Moll. 2014. "Knowledge Growth and the Allocation of Time." *Journal of Political Economy* 122 (1): 1–51.
- Lucassen, Jan, Tine de Moor, and Jan Luiten van Zanden. 2008. "The Return of the Guilds: Towards a Global History of the Guilds in Pre-Industrial Times." In *The Return of the Guilds*, edited by Jan Lucassen, Tine de Moor, and Jan Luiten van Zanden, 5–18. Cambridge: Cambridge University Press.
- Luttmer, Erzo G. J. 2007. "Selection, Growth, and the Size Distribution of Firms." *Quarterly Journal of Economics* 122 (3): 1103–1144.
- ——. 2015. "An Assignment Model of Knowledge Diffusion and Income Inequality." Unpublished Manuscript, University of Minnesota.
- Macgowan, Daniel J. 1888-89. "Chinese Guilds or Chambers of Commerce and Trades Unions." *Journal of North-China Branch of the Royal Asiatic Society* 21:133–192.
- Maddison, Angus. 2010. "Statistics on World Population, GDP and Per Capita GDP, 1–2008 AD." Available from http://www.ggdc.net/maddison/oriindex.htm.
- Meisenzahl, Ralf R., and Joel Mokyr. 2012. "The Rate and Direction of Invention in the British Industrial Revolution: Incentives and Institutions." In *The Rate and Direction of Innovation*, edited by In Scott Stern and Joshua Lerner, 443–479. Chicago: University of Chicago Press.
- Minns, Chris, and Patrick Wallis. 2013. "The Price of Human Capital in a Pre-industrial Economy: Premiums and Apprenticeship Contracts in 18th Century England." *Explorations in Economic History* 50 (3): 335–350.
- Mitterauer, Michael. 2010. Why Europe?: The Medieval Origins of Its Special Path. Chicago: University Of Chicago Press.
- Mokyr, Joel. 2002. *The Gifts of Athena. Historical Origins of the Knowledge Economy*. Princeton: Princeton University Press.
- ———. 2008. "The Institutional Origins of the Industrial Revolution." In *Institutions and Economic Performance*, edited by Elhanan Helpman, 64–119. Cambridge MA: Harvard University Press.
- Moll-Murata, Christine. 2013. "Guilds and Apprenticeship in China and Europe: The Jingdezhen and European Ceramics Industries." Chapter 7 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan Luiten van Zanden and Marten Prak. Boston: Brill.
- Morse, Hosea Ballou. 1909. *The Gilds of China: With an Account of the Gild Merchant or Co-hong of Canton*. London: Longmans, Green and Co.

- Nagata, Mary Louise. 2007. "Apprentices, Servants and Other Workers: Apprenticeship in Japan." In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Steven L. Kaplan Bert De Munck and Hugo Soly, 35–45. New York: Berghahn Books.
- ———. 2008. "Brotherhoods and Stock Societies: Guilds in Pre-modern Japan." In *The Return of the Guilds*, edited by Jan Lucassen, Tine de Moor, and Jan Luiten van Zanden, 121–142. Cambridge: Cambridge University Press.
- Ogilvie, Sheilagh. 2004. "Guilds, Efficiency and Social Capital: Evidence from German Proto-industry." *Economic History Review* 57 (2): 286–333.
- ——. 2014. "The Economics of Guilds." *Journal of Economic Perspectives* 28 (4): 169–92.
- ——. 2016. "The European Guilds: an Economic Assessment." Unpublished Book Manuscript.
- Perla, Jesse, and Christopher Tonetti. 2014. "Equilibrium Imitation and Growth." *Journal of Political Economy* 122 (1): 52–76.
- Prak, Maarten. 2013. "Mega-structures of the Middle Ages: The Construction of Religious Buildings in Europe and Asia, c.1000-1500." Chapter 4 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan Luiten van Zanden and Marten Prak. Boston: Brill.
- Reith, Reinhold. 2007. "Apprentices in the German and Austrian Crafts in Early Modern Times: Apprentices as Wage Earners?" In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Steven L. Kaplan Bert De Munck and Hugo Soly, 179–99. New York: Berghahn Books.
- ———. 2008. "Circulation of Skilled Labour in Late Medieval and Early Modern Central Europe." In *Guilds, Innovation and the European Economy*, 1400–1800, edited by S. R. Epstein and Maarten Prak, 114–142. Cambridge University Press.
- Roberts, Lissa, and Simon Schaffer. 2007. "Preface." In *The Mindful Hand: Inquiry and Invention from the late Renaissance to early Industrialization*, edited by Simon Schaffer Lissa Roberts and Peter Dear, xiii–xxvii. Amsterdam: Royal Netherlands Academy of Arts and Sciences.
- Romer, Paul M. 1990. "Endogenous Technological Change." *Journal of Political Economy* 98 (5): S71–S102.
- Rosenthal, Jean-Laurent, and R. Bin Wong. 2011. *Before and Beyond Divergence: The Politics of Economic Change in China and Europe*. Cambridge, MA: Harvard University Press.
- Rowe, William T. 1990. "Success Stories: Lineage and Elite Status in Hanyang County, Hubei, c. 1368-1949." In *Chinese Local Elites and Patterns of Dominance*, edited by Joseph W. Esherick and Mary Backus Rankin. Berkeley: University of California Press.

- Roy, Tirthankar. 2013. "Apprenticeship and Industrialization in India, 1600-1930." Chapter 2 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan Luiten van Zanden and Marten Prak. Boston: Brill.
- Rushton, Peter. 1991. "The Matter in Variance: Adolescents and Domestic Conflict in the Pre-Industrial Economy of Northeast England, 1600-1800." *Journal of Social History* 25 (1): 89–107.
- Schalk, Ruben. 2016. "Apprenticeships and Craft Guilds in the Netherlands, 1600–1900." Centre for Global Economic History Working Paper No. 80.
- Shiue, Carol H. 2016. "A Culture of Kinship: Chinese Genealogies as a source for research in demographic economics." *Journal of Demographic Economics* 82:459–482.
- Shorter, Edward. 1975. The Making of the Modern Family. New York: Harper Torch Books.
- Smith, Steven R. 1973. "The London Apprentices as Seventeenth-Century Adolescents." *Past & Present* 61:149–161.
- Spagnolo, Giancarlo. 1999. "Social Relations and Cooperation in Organizations." *Journal of Economic Behavior and Organization* 38 (1): 1–25.
- Squicciarini, Mara P., and Nico Voigtländer. 2015. "Human Capital and Industrialization: Evidence from the Age of Enlightenment." *Quarterly Journal of Economics* 130 (4): 1825–1883.
- Stabel, Peter. 2007. "Social Mobility and Apprenticeship in Late Medieval Flanders." In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Steven L. Kaplan Bert De Munck and Hugo Soly, 158–78. New York: Berghahn Books.
- Steffens, Sven. 2001. "Le métier volé: transmission des savoir-faire et socialization dans les métiers qualifiés au XIXe siècle." *Revue du Nord* 15:121–135.
- Steidl, Annemarie. 2007. "Silk Weaver and Purse Maker Apprentices in Eighteenth and Nineteenth Century Vienna." In *Learning on the Shop Floor: Historical Perspectives on Apprenticeship*, edited by Bert De Munck, Steven L. Kaplan, and Hugo Soly, 133–57. New York: Berghahn Books.
- Trivellato, Francesca. 2008. "Guilds, Technology, and Economic Change in early modern Venice." In *Guilds, Innovation and the European Economy*, 1400-1800, edited by Stephan R. Epstein and Maarten Prak, 199–231. Cambridge: Cambridge University Press.
- Unger, Richard W. 2013. "The Technology and Teaching of Shipbulding: 1300–1800." Chapter 5 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan Luiten van Zanden and Marten Prak. Boston: Brill.
- van Zanden, Jan Luiten. 2009. *The Long Road to the Industrial Revolution: The European Economy in a Global Perspective*, 1000–1800. Boston: Brill.

- van Zanden, Jan Luiten, and Marten Prak. 2013a. "Technology and Human Capital Formation in the East and West Before the Industrial Revolution." Chapter 1 of *Technology, Skills and the Pre-Modern Economy in the East and the West*, edited by Jan Luiten van Zanden and Marten Prak. Boston: Brill.
- ——. 2013b. Technology, Skills and the Pre-Modern Economy in the East and the West. Boston MA: Brill.
- Voigtländer, Nico, and Hans-Joachim Voth. 2013a. "How the West "Invented" Fertility Restriction." *American Economic Review* 103 (6): 2227–64.
- ———. 2013b. "The Three Horsemen of Riches: Plague, War, and Urbanization in Early Modern Europe." *Review of Economic Studies* 80 (2): 774–811.
- Vollrath, Dietrich. 2011. "The Agricultural Basis of Comparative Development." *Journal of Economic Growth* 16 (4): 343–370.
- Von Glahn, Richard. 2016. *An Economic History of China: From Antiquity to the Nineteenth Century*. Cambridge: Cambridge University Press.
- Wallis, Patrick. 2008. "Apprenticeship and Training in Premodern England." *Journal of Economic History* 68 (3): 832–861.
- ——. 2012. "Labor, Law, and Training in Early Modern London: Apprenticeship and the City's Institutions." *Journal of British Studies* 51:791–819.
- Yildirim, Onur. 2008. "Ottoman Guilds in the Early Modern Era." In *The Return of the Guilds*, edited by Jan Lucassen, Tine de Moor, and Jan Luiten van Zanden, 73–93. Cambridge: Cambridge University Press.
- Zelin, Madeleine, Jonathan Ocko, and Robert Gardella. 2004. *Contract and Property in Early Modern China*. Stanford: Stanford University Press.
- Zhu, Huasheng, Kelly Wanjing Chen, and Juncheng Dai. 2016. "Beyond Apprenticeship: Knowledge Brokers and Sustainability of Apprentice-Based Clusters." Sustainability 8, no. 12.

# **Online Appendices**

#### A Extension with Farmers

In this section, we sketch how the model can be extended by including farm labor as a separate input in production. This extension addresses the concern that in the pre-industrial era, most people were engaged in food production, whereas craftspeople made up a smaller fraction of the population.

The economy produces two goods, food *F* and manufactured goods *M*. Manufactured goods are produced under constant returns with effective craftsmen's labor *L* as the only input:

$$M = L$$
.

Food is produced using a Cobb-Douglas technology that uses land X and farm labor  $N_f$ :

$$F = (N_f)^{\frac{1-\alpha-\beta}{1-\beta}} X^{\frac{\alpha}{1-\beta}}$$

with  $\alpha$ ,  $\beta \in (0,1)$ . An individual has Cobb-Douglas utility over consumption of food f and manufactured goods m, and total utility (including the altruistic component) is:

$$u(c, I') = m^{\beta} f^{1-\beta} + \gamma I'. \tag{25}$$

The setup is equivalent to one with a single consumption good c (a composite of food and manufactured goods) as in (1) that is produced with the aggregate production function:

$$Y = (N_f)^{1-\alpha-\beta} L^{\beta} X^{\alpha}.$$

The total amount of land is normalized to one, X = 1, and land is owned by farmers.

There are now three aggregate state variables:  $N_f$  (population of farmers),  $N_m$  (population of craftsmen), and k. Let  $N = N_m + N_f$  be the total number of adults. Farmers and craftsmen have the same survival rate and there is no intergenerational mobility across occupations. Hence, the laws of motion for population are:

$$N'_m = n \ N_m, \quad N'_f = n \ N_f, \quad N' = N'_m + N'_f = n \ N.$$

As a consequence, the share of both groups in the total population is constant. We define  $\rho$  as

$$\rho = \frac{N_m}{N}.$$

The assumptions of equal population growth and no occupational mobility are made for simplicity. In reality, it is well known that in pre-industrial times cities (where craftsmen were concentrated) experienced much higher mortality than the countryside, so that there was net migration into cities. Allowing for such rural-urban migration could be accommodated in our framework and would leave the main results intact, but would come at the cost of complicating the analysis.

Given that our focus is on knowledge transmission rather than urbanization, we abstract from such features here.

Given those two changes to the specification, the rest of analysis carries on. Two new parameters are involved. The market equilibrium condition (18) becomes:

$$\delta'(a^{\mathbf{M}}) - \kappa = \frac{\gamma \theta \beta}{\rho} \frac{1}{a^{\mathbf{M}}/n^{\mathbf{M}} + \nu} y^{\mathbf{M}}.$$

The extension with farmers clarifies that the Malthusian constraint matters even if there are constant returns to scale in the craftsmen's sector. Along a balanced growth path, manufacturing output grows faster than food output. This depresses the relative price of manufactured goods (produced by craftsmen). Specifically, in a given period the relative price of manufactured goods is given by:

$$\frac{p_M}{p_F} = \frac{\beta}{1-\beta} \frac{\left(N_f\right)^{\frac{1-\alpha-\beta}{1-\beta}} X^{\frac{\alpha}{1-\beta}}}{L}.$$

The declining relative price of the income of craftsmen implies that their effective income (in terms of the composite consumption good) is constant in the balanced growth path even though their output is growing.

It also becomes easier to analyze the role of parameter  $\alpha$ , as now, this one only plays a role in the Malthusian constraint. A low  $\alpha$  corresponds to labor-intensive agriculture. In this case returns to population size decrease at a lower rate, and hence an increase in productivity growth leads to a larger shift in population growth and income per capita compared to the case of a large land share.<sup>51</sup> It modifies the incentives to move to another mode of organizing apprenticeship, as detailed in Proposition 8.

#### **Proposition 8 (Effect of Labor-Intensive Agriculture).**

If Agriculture is labor intensive (low  $\alpha$ ), the long-term gains in growth from moving from family to market,  $g^{M} - g^{F}$ , and from clan to market,  $g^{M} - g^{C}$ , are reduced. But the gain from moving from family to clan,  $g^{C} - g^{F}$ , is increased.

Figure 6 shows the result graphically. An implication of this proposition is that a country with labor intensive agriculture has more incentives to adopt the clan than the family.

# B Extension with the "Leonardo da Vinci" Assumption

In this section, we allow for the possibility that advanced techniques may be "ahead of their time," in the sense that their full productive value can only be realized at a higher state of aggregate knowledge. For example, Leonardo da Vinci invented a number of machines and devices that could be successfully built only centuries later. To capture this feature in a simple way, we assume that each craftsman has a potential output which is linked to own knowledge  $h_i$ , but that

<sup>&</sup>lt;sup>51</sup>Vollrath (2011) argues that agriculture in pre-industrial China was more labor intensive compared to Europe (due to the possibility of multiple crops per year, wet-field rice production etc.), and that this accounts for part of observed differences in living standards.

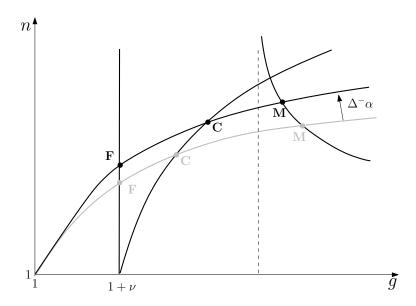


Figure 6: Effect of labor intensive agriculture

the craftsman may be constrained by the average state of knowledge in the economy. Specifically, the potential output  $\bar{q}_i$  of a craftsman with knowledge  $h_i$  is given by:

$$\bar{q}_i = h_i^{-\theta}. \tag{26}$$

The actual output  $q_i$  of a craftsman cannot exceed the average potential output  $\bar{q} = \mathbb{E}(\bar{q}_i)$  in the economy, so that:

$$q_i = \min\{\bar{q}_i, \bar{q}\}. \tag{27}$$

The assumption that individual productivity is constrained by aggregate knowledge is not essential to any of our results. Still, without this assumption in any period there would be some masters with arbitrarily high output, which is implausible. With the constraint, a good part of the knowledge in the economy is latent knowledge that will unfold its full potential only in later generations. This closely relates to Mokyr (2002)'s argument that the growth of productivity is constrained by the epistemic base on which a technique rests. The more people using a technique understand the science behind it, the broader the base. According to Mokyr (2002), this basis was very narrow in pre-modern Europe and gradually became wider.

Figure 7 illustrates the distribution of actual output  $q_i$  among craftsmen for two values of knowledge k, where the dashed line corresponds to a higher state of knowledge. The kinks in the distribution functions represent the points above which potential productivity is constrained by the average knowledge in the society. Because of the specific shape of the exponential distribution, the share of craftsmen who are constrained by the average knowledge is constant (and given by 1/e).

Given the exponential distribution for  $h_i$  and (26), potential output  $\bar{q}_i$  follows a Fréchet distribution with scale parameter  $k^{\theta}$  and shape parameter  $1/\theta$ .

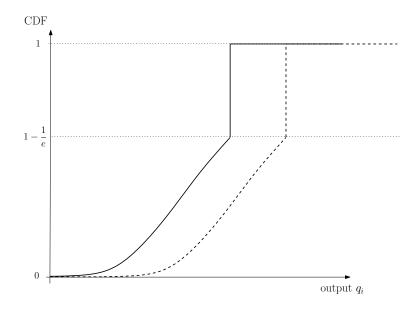


Figure 7: Distribution Function of Productivity at time t (solid line) and t' > t (dashed line)

We can now express the total supply of effective labor by craftsmen as a function of state variables. The average potential output across craftsmen is given by:

$$\bar{q} = \int_0^\infty h_i^{-\theta} \left( k \exp(-kh_i) \right) dh_i = \int_0^\infty k^{\theta} (kh_i)^{-\theta} \exp(-kh_i) kdh_i = k^{\theta} \Gamma(1-\theta),$$

where  $\Gamma(t) = \int_0^\infty x^{t-1} \exp(-x) dx$  is the Euler gamma function. Given (27), the actual output  $q_i$  of a craftsman is:

$$q_i = \min\{\bar{q}_i, \bar{q}\} = \min\left[h_i^{-\theta}, k^{\theta}\Gamma(1-\theta)\right].$$

The threshold for  $h_i$  below which craftsmen are constrained by average knowledge is given by:

$$\hat{h} = k^{-1} \Gamma (1 - \theta)^{-1/\theta}.$$

The expected supply of output of a given craftsman is:

$$\mathbb{E}(q_i) = \int_0^{\hat{h}} k^{\theta} \Gamma(1-\theta) k \exp[-kh_i] dh_i + \int_{\hat{h}}^{\infty} h_i^{-\theta} k \exp[-kh_i] dh_i$$

$$= k^{\theta} \Lambda.$$

Here  $\Lambda$  is a constant given by:

$$\Lambda = \Gamma(1-\theta) + \exp[-\Gamma(1-\theta)^{-1/\theta}]\theta\Gamma(-\theta) + \Gamma(1-\theta,\Gamma(1-\theta)^{-1/\theta}),$$

and  $\Gamma(t,s) = \int_s^\infty x^{t-1} \exp(-x) dx$  is the incomplete gamma function. The total supply of craftsmen's labor L in efficiency units is then given by the expected output per craftsmen  $\mathbb{E}\left(q_i\right)$  mul-

tiplied by the number of craftsmen *N*:

$$L = N k^{\theta} \Lambda$$
.

In sum, all the results in the benchmark continue to hold with the "Leonardo" assumption, up to some constant terms:  $\Gamma(1-\theta)$  should be replaced by  $\Lambda$ .

In the proof of Proposition 3, the "Leonardo" assumption requires to compute  $\partial \mathbb{E}(q')/\partial k'$  differently. In particular, in deriving  $\mathbb{E}(q')$  with respect to k' we should be careful in taking as given the future average society knowledge  $\bar{q}' = (k')^{\theta} \Gamma(1-\theta)$ , i.e. the externality in (27). More precisely, (27) should be written as:

$$\mathbb{E}(q') = \int_0^{\hat{h}'} \underbrace{(k')^{\theta} \Gamma(1-\theta)}_{\bar{q} \text{ (exogenous)}} k' \exp[-k'h_i] dh_i + \int_{\hat{h}'}^{\infty} h_i^{-\theta} k' \exp[-k'h_i] dh_i$$

where

$$\hat{h}' = \Gamma(1 - \theta)^{-1/\theta} / k'.$$

Integrating we obtain:

$$\mathbb{E}(q') = (1 - \exp[\Gamma(1 - \theta)/\theta]) \,\bar{q} + (k')^{\theta} \,\Gamma(1 - \theta, \Gamma(1 - \theta)^{-1/\theta})$$

and the derivative is

$$\frac{\partial \mathbb{E}(q')}{\partial k'} = \theta \Gamma(1 - \theta, \Gamma(1 - \theta)^{-1/\theta})(k')^{\theta - 1} = \Theta(k')^{\theta - 1}.$$

with  $\Theta = \theta \Gamma(1 - \theta, \Gamma(1 - \theta)^{-1/\theta})$ . Compared to the benchmark, there is a factor  $\Gamma(1 - \theta, \Gamma(1 - \theta)^{-1/\theta})$  instead of a factor  $\Gamma(1 - \theta)$ .

The model with the "Leonardo" assumption also speaks to the role of the unlimited support of knowledge in the baseline model. One may regard this assumption as unattractive, because it implies that everything that can be known is already known to at least someone from the beginning of time. The model extension shows that our results remain intact of the support of realized productivity is bounded. Moreover, one can regard this extension as an approximation of a model where latent knowledge is bounded as well, i.e., where there is a point mass of knowledge at the upper bound. The difference between such a model and the "Leonardo" extension is that in the "Leonardo" model the upper bound moves up in proportion to average knowledge, whereas with bounded support the upper bound would stay in place. Yet because growth of average knowledge is slow, the two models would be yield near-identical implications in the short and medium run (although if the rate of creation of new knowledge were zero, growth would peter out in the long run). Hence, one can regard our analysis as an approximation of a model with a finite support of knowledge.

# C Proof of Proposition 2

The threshold for sufficient altruism is given by

$$\hat{\gamma} = \frac{(\delta(n^{\mathrm{F}}) - \kappa n^{\mathrm{F}}) \, \bar{n}s}{(1 - \alpha)(n^{\mathrm{F}})^2} \Gamma(1 - \theta), \quad \text{with } n^{\mathrm{F}} = (1 + \nu)^{\frac{(1 - \alpha)\theta}{\alpha}}.$$

We claim that the balanced growth path exists if  $\gamma > \max\{0, \hat{\gamma}\}$ .

Let us first compute the balanced growth path, supposing it exists. The growth rate of knowledge in (b) comes from (13) where we have imposed  $m=m^{\rm F}=1$ . Population growth is obtained using (10). Income per capita in (c) derives from (9). Utility in (d) is derived as follows: Income of a given craftsman is  $q_i (1-\alpha) \frac{Y}{L} + \kappa a^{\rm F}$  (from (5)). Expected income, using (6), is  $k^{\theta}\Gamma(1-\theta)(1-\alpha) \frac{Y}{L} + \kappa a^{\rm F} + \alpha y^{\rm F}$ , where  $\alpha y^{\rm F}$  is income from owning land. Given the value of L from (7), this simplifies into  $(1-\alpha) \frac{Y}{N} + \kappa a^{\rm F} + \alpha y^{\rm F}$ . The future labor income of the child is  $(1-\alpha)y^{\rm F}$ .

For the balanced growth path defined above to be incentive compatible, i.e. parents are indeed willing to provide their kids with teaching, the cost of teaching should be less than the gain in the income, as evaluated by the altruistic parents. Normalizing the labor income of a craftsman without training to zero, this condition is:

$$\delta(n^{\rm F}) - \kappa n^{\rm F} < \gamma \; n^{\rm F} E \left[ (1 - \alpha) q \frac{\Upsilon}{L} \right] = \gamma \; n^{\rm F} (1 - \alpha) y^{\rm F}.$$

Using (6) and (7), this condition determines a lower bound on the altruism factor  $\gamma$ :

$$\hat{\gamma} > \frac{(\delta(n^{\mathrm{F}}) - \kappa n^{\mathrm{F}}) \, \bar{n}s}{(1 - \alpha)(n^{\mathrm{F}})^2} \Gamma(1 - \theta).$$

# D Proof of Proposition 3

The required threshold for altruism is given by:

$$\gamma > \frac{\delta'\left((1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}}\right) - \kappa}{\frac{(1-\alpha)\nu\theta}{\bar{n}s}(1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}-2}}.$$

Let us first compute the balanced growth path, supposing it exists. To determine the number of apprentices per master, we use (14). Equation (15) is derived as follows. Each apprentice learns from  $m^c = (n^c)^o$  masters. As the draws for the initial knowledge of masters are not independent (all these masters were educated by the same persons), their acquired knowledge  $k^i$  is the same, but they had different ideas on their own drawn from  $\text{Exp}(\nu k_{-1})$ . The acquired knowledge of the apprentices thus follows:

$$(k^i)' = k^i + m^{\mathsf{C}} \nu k_{-1}.$$

The final knowledge of the apprentices is given by

$$k' = (k^i)' + \nu k.$$

Using  $(k^i)' = k' - \nu k$  and  $(k^i) = k - \nu k_{-1}$  in the first equation, we get

$$k' - \nu k = k - \nu k_{-1} + m^{c} \nu k_{-1}$$
(28)

which leads to (15) where g = k'/k.

The average utility expression takes into account the flows between master and apprentices. Adults are paid as masters by  $a^c$  parents the amount of  $\delta'(a^c) - \kappa$ . Their disutility net of income from apprentices is  $\delta(a^c) - \kappa(a^c)$ . They also pay as parents the same amount  $\delta'(a^c) - \kappa$  for each of their children  $a^c$  to each of their master  $a^c$ . The balance is:

$$a^{\mathsf{c}}(\delta'(a^{\mathsf{c}}) - \kappa) - (\delta'(a^{\mathsf{c}}) - \kappa) - m^{\mathsf{c}}n^{\mathsf{c}}(\delta'(a^{\mathsf{c}}) - \kappa) = -(\delta(a^{\mathsf{c}}) - \kappa a^{\mathsf{c}}).$$

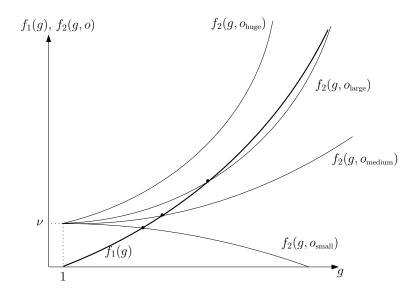


Figure 8: Equation (29)

From Equation (15) and the value of  $n^c$ , the growth rate  $g = g^c$  should satisfy:

$$g^2 - (1+\nu)g + \nu = \nu g^{\frac{(1-\alpha)\theta_0}{\alpha}}.$$
 (29)

The left hand side is a convex function  $f_1(g)$ , while the right hand side is a function of g and o,  $f_2(g,o)$ . Figure 8 represents these two functions for different sizes of the clan. At the minimum possible value of g, the left hand side is smaller than the right hand side:

$$f_1(1) = 0 < f_2(1, o) = \nu \forall o > 0.$$

Several cases may occur:

• For  $o \le \frac{\alpha}{(1-\alpha)\theta}$ ,  $f_2(g,o)$  is concave, crosses  $f_1(g)$  once, and there exist a solution to the equality (29).

• For  $\frac{\alpha}{(1-\alpha)\theta} < o \le \frac{2\alpha}{(1-\alpha)\theta}$ , one can apply the l'Hospital rule twice to show that

$$\lim_{g\to\infty}\frac{f_1(g)}{f_2(g,o)}>1,$$

implying that  $f_2(g, o)$  is below  $f_1(g)$  for large g and crosses it once. Hence there exist a

- solution to the equality (29). If  $o > \frac{2\alpha}{(1-\alpha)\theta}$  but not "too large,"  $f_2(g,o)$  cuts  $f_1(g)$  twice. There are two balanced growth paths.
- For o very large, the function  $f_2(g, o)$  which is above  $f_1(g)$  for g = 1, stays above it as gincreases. In that case, there is no solution to Equation (29), and no balanced growth path. The interpretation is that the clan is so big that technological level and population grow at an accelerating rate.

We can summarize these findings by defining  $\bar{o}$ , such that if  $o \leq \bar{o}$ , a balanced growth path exists. Differentiating (29), the effect of *o* on *g* is given by:

$$\frac{dg}{do} = \frac{\partial f_2/\partial o}{\partial f_1/\partial g - \partial f_2/\partial g}.$$

The term  $\partial f_2/\partial o$  is positive as g>1. We conclude that increasing o increases g for equilibria where  $\partial f_1/\partial g > \partial f_2/\partial g$ , that is where  $f_2(g,o)$  cuts  $f_1(g)$  from above as g increases.

Let us now consider whether such an equilibrium is incentive compatible. If o is too low, the threat of punishment is insufficient to prevent shirking, and only the family equilibrium exists. If o is large, parents may no longer be willing to apprentice their children with all current adult members of the clan. In other words, the clan should be large enough for the threat of punishment to ensure compliance, but small enough for parents to be willing to pay the apprenticeship fee. Hence, there exists thresholds  $o_{min}$  and  $o_{max}$  such that if  $o_{max} > o > o_{min}$  the clan equilibrium is incentive compatible.

Assuming that the punishment technology is such that one person can do only negligible harm to another, but more than one person can exert a much more damaging action, sufficient in any case to deter shirking, we get  $o_{\min} = 0.52$  Let us now consider  $o_{\max}$ .

The clan equilibrium is sustained if, for each child, the marginal cost paid to the master is lower than the expected marginal benefit, as priced by the parents:

$$\delta'(a) - \kappa \le \gamma \frac{\partial \mathbb{E}(q')}{\partial k'} \frac{\partial k'}{\partial m} (1 - \alpha) \frac{Y'}{L'}. \tag{30}$$

The right hand side represents the expected effect on individual productivity of meeting an additional master.  $(1-\alpha)\frac{Y'}{U}$  is exogenous for the individual, and the altruism parameter  $\gamma$  reflects that the marginal benefit is seen from the point of view of the parent.

Let us first consider the term  $\partial \mathbb{E}(q')/\partial k'$ . From (6), the derivative is

$$\frac{\partial \mathbb{E}(q')}{\partial k'} = \theta \Gamma (1 - \theta) (k')^{\theta - 1}.$$

<sup>&</sup>lt;sup>52</sup>Considering *o* as a continuous variable

The term  $\partial k'/\partial m$  can be directly obtained using (28) and is equal to  $\nu k_{-1}$ . Finally, the term Y'/L' can be transformed into:

$$\frac{Y'}{L'} = \frac{Y'}{N'} \frac{N'}{L'} = \frac{Y'}{N'} \frac{1}{\Gamma(1-\theta)(k')^{\theta}}$$

$$\tag{31}$$

using (7). Condition (30) can now be rewritten as:

$$\delta'(a) - \kappa \le \gamma \theta(k')^{\theta - 1} \nu k_{-1} (1 - \alpha) \frac{Y'}{N'} \frac{1}{(k')^{\theta}}.$$
 (32)

which, along a balanced growth path, reduces to

$$\delta'\left((g^{\mathsf{C}})^{\frac{(1-\alpha)\theta(o+1)}{\alpha}}\right) - \kappa \leq \frac{\gamma(1-\alpha)\nu\theta}{\bar{n}s} \left(g^{\mathsf{C}}\right)^{\frac{(1-\alpha)\theta}{\alpha}-2}.$$

The left hand side is increasing in o as  $g^c > 1$ ,  $g^c$  is increasing in o, and  $\delta(a)$  is convex. If it is smaller than the right hand side for the minimum value of o (o = 0,  $g^c = 1 + \nu$ ), i.e. if

$$\delta'\left((1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}}\right) - \kappa < \frac{\gamma(1-\alpha)\nu\theta}{\bar{n}s}(1+\nu)^{\frac{(1-\alpha)\theta}{\alpha}-2}.$$

then either the right hand side becomes larger than the left hand side for some value of  $o = \hat{o} > 0$ , or they never intersect, in which case  $\hat{o}$  is infinite. Notice that the right hand side is decreasing in  $g^c$ , and hence in o, provided that

$$(1-\alpha)\theta < 2\alpha$$

in which case,  $o_{max}$ , the maximum size of the clan which is incentive compatible, is necessarily finite.

In the analysis of the incentive compatibility, we have assumed that  $g^c$  was defined, we show above that it is not the case  $o > \bar{o}$ . Hence, the threshold above which a balanced growth path exists and is incentive compatible is  $o_{max} = \min{\{\bar{o}, \hat{o}\}}$ .

### E Proof of Lemma 1

The first-order condition for the parent's problem can be written as:

$$\underbrace{p}_{\text{marginal cost}} n = \gamma \, n \, \underbrace{\frac{\partial \mathbb{E}\left(q'\right)}{\partial k'} \frac{\partial \mathbb{E}\left(k'\right)}{\partial m} \left(1 - \alpha\right) \frac{Y'}{L'}}_{\text{marginal benefit } \left(\partial I' / \partial m\right)}.$$

Remembering from (6) that

$$\frac{\partial \mathbb{E}(q')}{\partial k'} = \theta \Gamma (1 - \theta) (k')^{\theta - 1},$$

and using  $k' = k(m + \nu)$  (from (13)) as masters are now drawn randomly, we obtain, in equilibrium:

$$\delta'(a) - \kappa = p = \gamma \theta \Gamma(1 - \theta) \frac{(k')^{\theta}}{m + \nu} (1 - \alpha) \frac{Y'}{L'}.$$

Using (7), this equation simplifies into

$$\delta'(a) - \kappa = \gamma \theta (1 - \alpha) \frac{1}{m + \nu} \frac{Y'}{N'}.$$

# F Proof of Proposition 4

For a fixed number of masters *m*, the market equilibrium yields higher growth in productivity because those masters are drawn randomly. Indeed, from the proof of Proposition 3, productivity in **C** follows

$$k' = (1 + \nu)k + (m - 1)\nu k_{-1}$$

which implies a growth rate equal to:

$$g^{c} = \frac{1 + \nu + \sqrt{(1 + \nu)^{2} + 4(m - 1)\nu}}{2}$$

which is always less than the growth rate with the market,  $m + \nu$ , for  $\nu > 0$  and m > 1.

Moreover, the equilibrium number of masters  $m^{M}$  is higher in the market equilibrium compared to the clan equilibrium. Indeed,  $m^{M}$  balances marginal cost and benefit. If the clan equilibrium had a higher number of masters, it would not be incentive compatible (parents would not like to pay all those masters).

Notice that, in the computation of the utility, the payments from apprentices,  $pa^{M}$ , and for children,  $pn^{M}m^{M}$ , balance.

### G Proof of Lemma 2

The maximization problem of the guild is:

$$\max_{a_j} \left\{ p_j a_j - \delta(a_j) + \kappa a_j \right\}$$

subject to:

$$S_{j}N'm_{j} = Na_{j},$$

$$p_{j} = \gamma \frac{\partial EI'_{ij}}{\partial m_{j}},$$

$$\gamma EI'_{ij} - p_{j}m_{j} = \gamma (1 - \alpha) \frac{Y'}{N'} - pm.$$
(33)

Replacing  $p_i$  and p by their value from the second constraint into the third leads to:

$$\gamma(S'_j)^{\frac{1}{\lambda}-1} \left(\frac{k'_j}{k'}\right)^{\frac{\theta}{\lambda}} - \frac{\theta}{m_j + \nu} \left(S'_j\right)^{\frac{1}{\lambda}-1} \left(\frac{k'_j}{k'}\right)^{\frac{\theta}{\lambda}} m_j = \gamma - \frac{\theta}{m + \nu} m.$$

which can be solved for  $S_i'$ :

$$S'_{j} = \left[ \frac{(\gamma - \theta) m + \gamma \nu}{(\gamma - \theta) m_{j} + \gamma \nu} \left( \frac{m_{j} + \nu}{m + \nu} \right)^{1 - \frac{\theta}{\lambda}} \right]^{\frac{\lambda}{1 - \lambda}}.$$

The second constraint can be rewritten as:

$$p_{j} = \gamma \theta (1 - \alpha) \frac{1}{m + \nu} \frac{Y'}{N'} \frac{(\gamma - \theta) m + \gamma \nu}{(\gamma - \theta) m_{j} + \gamma \nu}$$

and the equilibrium on the apprenticeship market (33) is:

$$a_j = n S'_j m_j$$
.

These constraints imply that lowering the supply of apprenticeships  $a_j$  increases the price  $p_j$ . It is now easier to express the maximization program in terms of  $m_j$ :

$$\max_{m_{j}}\left\{\left(\frac{\gamma\theta(1-\alpha)}{m+\nu}\,\frac{Y'}{N'}\,\frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\gamma-\theta\right)m_{j}+\gamma\nu}+\kappa\right)n\,S'_{j}\,m_{j}-\delta\left(n\,S'_{j}\,m_{j}\right)\right\}.$$

The first order condition is:

$$\begin{split} -\left(\gamma-\theta\right)\left(\frac{\gamma\theta(1-\alpha)}{m+\nu}\,\frac{Y'}{N'}\,\frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\left(\gamma-\theta\right)m_{j}+\gamma\nu\right)^{2}}\right)\,S'_{j}\,m_{j}+\\ &\left(\left(\frac{\gamma\theta(1-\alpha)}{m+\nu}\,\frac{Y'}{N'}\,\frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\gamma-\theta\right)m_{j}+\gamma\nu}+\kappa\right)-\delta'\left(n\,S'_{j}\,m_{j}\right)\right)\left(\frac{\partial S'_{j}}{\partial m_{j}}\,m_{j}+S'_{j}\right)=0 \end{split}$$

with

$$\begin{split} \frac{\partial S_{j}'}{\partial m_{j}} &= \frac{\lambda}{1-\lambda} \left[ \frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\gamma-\theta\right)m_{j}+\gamma\nu} \left(\frac{m_{j}+\nu}{m+\nu}\right)^{1-\frac{\theta}{\lambda}} \right]^{\frac{\lambda}{1-\lambda}-1} \\ &\times \left( -\left(\gamma-\theta\right) \frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\left(\gamma-\theta\right)m_{j}+\gamma\nu\right)^{2}} \left(\frac{m_{j}+\nu}{m+\nu}\right)^{1-\frac{\theta}{\lambda}} \right. \\ &\left. + \left(1-\frac{\theta}{\lambda}\right) \frac{\left(\gamma-\theta\right)m+\gamma\nu}{\left(\gamma-\theta\right)m_{j}+\gamma\nu} \left(\frac{m_{j}+\nu}{m+\nu}\right)^{-\frac{\theta}{\lambda}} \right). \end{split}$$

At the symmetric Nash equilibrium between guilds, this becomes:

$$-(\gamma - \theta) \left( \frac{\gamma \theta (1 - \alpha)}{m + \nu} \frac{Y'}{N'} \frac{1}{(\gamma - \theta) m + \gamma \nu} \right) m + \left( \left( \frac{\gamma \theta (1 - \alpha)}{m + \nu} \frac{Y'}{N'} + \kappa \right) - \delta' (n m) \right) \left( \frac{\partial S'_j}{\partial m_j} m + 1 \right) = 0$$

with:

$$\frac{\partial S'_j}{\partial m_j} = \frac{\lambda}{1 - \lambda} \left( \frac{-(\gamma - \theta)}{(\gamma - \theta) m + \gamma \nu} + \left( 1 - \frac{\theta}{\lambda} \right) \right),$$

which we can rearrange into:

$$\frac{\gamma\theta(1-\alpha)}{m+\nu}\frac{Y'}{N'}\left(\frac{-\left(\gamma-\theta\right)m}{\left(\gamma-\theta\right)m+\gamma\nu}+\frac{\partial S'_{j}}{\partial m_{j}}m+1\right)+\left(\kappa-\delta'\left(n\;m\right)\right)\left(\frac{\partial S'_{j}}{\partial m_{j}}\;m+1\right)=0$$

and finally:

$$\delta'(nm) - \kappa = \left(\frac{\gamma \theta(1-\alpha)}{m+\nu} \frac{Y'}{N'}\right) \Omega(m)$$

with:

$$\Omega(m) = \frac{\left(\frac{-(\gamma - \theta)m}{(\gamma - \theta)m + \gamma \nu} + 1 + \frac{\lambda m}{1 - \lambda} \left(\frac{-(\gamma - \theta)}{(\gamma - \theta)m + \gamma \nu} + \left(1 - \frac{\theta}{\lambda}\right)\right)\right)}{1 + \frac{\lambda m}{1 - \lambda} \left(\frac{-(\gamma - \theta)}{(\gamma - \theta)m + \gamma \nu} + \left(1 - \frac{\theta}{\lambda}\right)\right)}.$$

 $\Omega(m)$  can be further simplified into:

$$\Omega(m) = \frac{1 - \lambda + (\lambda - \theta)m - \frac{(\gamma - \theta)m}{(\gamma - \theta)m + \gamma \nu}}{1 - \lambda + (\lambda - \theta)m - \lambda \frac{(\gamma - \theta)m}{(\gamma - \theta)m + \gamma \nu}}.$$

When  $\lambda \to 1$ ,  $\frac{\partial S_j'}{\partial m_j} \to \infty$  and  $\Omega(m) \to 1$ .

# **H** Proof of Proposition 5

Before considering the optimization problem, let us compute the effect of changing  $m_j$  on income  $I_j$ . Using Equation (7), we can compute the relative quantity of efficient labor in sector j as:

$$\frac{L_j'}{L'} = S_j' \left(\frac{k_j'}{k'}\right)^{\theta}.$$

With this expression, and with Equation (6), which adapts to trade j as  $Eq_j = \Gamma(1-\theta)k_j^{\theta}$ , it is convenient to rewrite expected income as:

$$EI'_{ij} = (1 - \alpha) \frac{Y'}{N'} (S'_j)^{\frac{1}{\lambda} - 1} \left(\frac{k'_j}{k'}\right)^{\frac{\theta}{\lambda}}.$$

Let us now compute the effect of changing  $m_j$  on individual income. Using the result in (31), and  $k'_j = (m_j + \nu)k_j$ , we get:

$$\frac{\partial E I_{ij}'}{\partial m_j} = \theta \Gamma (1 - \theta) \frac{(k_j')^{\theta}}{m_j + \nu} (1 - \alpha) \frac{Y'}{L'} \left(\frac{L_j'}{L'}\right)^{\frac{1}{\lambda} - 1}$$

which can moreover be simplified into, using (31):

$$\frac{\partial EI'_{ij}}{\partial m_i} = \theta(1-\alpha) \frac{(k'_j)^{\theta}}{(k')^{\theta}} \frac{1}{m_i + \nu} (1-\alpha),$$

leading to:

$$\frac{\partial EI'_{ij}}{\partial m_i} = \theta(1-\alpha) \frac{1}{m_i + \nu} \frac{Y'}{N'} (S'_j)^{\frac{1}{\lambda}-1} \left(\frac{k'_j}{k'}\right)^{\frac{\theta}{\lambda}}.$$

Marginal income is therefore equal to expected income multiplied by:  $\frac{\theta}{m_i+\nu}$ .

To study the equilibrium, one should consider Equation (24) replacing  $a^G$ ,  $m^G$  and  $y^G$  by their value:

$$\delta'((g^{\mathbf{G}} - \nu)n^{\mathbf{G}}) - \kappa = \gamma \theta (1 - \alpha) \frac{1}{g^{\mathbf{G}}} \frac{n^{\mathbf{G}}}{\bar{n}s} \Omega(g^{\mathbf{G}} - \nu). \tag{34}$$

This equation describes a relationship between  $g^G$  and  $n^G$  which we call the "apprenticeship monopolistic market," as it is derived from the demand for apprenticeship and the monopolistic behavior of the guild. Equation (34) can be rewritten as:

$$n^{\rm G} = \frac{\kappa}{\bar{\delta}(g^{\rm G} - \nu) - \frac{\gamma \theta (1 - \alpha)}{s\bar{n} g^{\rm G}} \Omega(g^{\rm G} - \nu)}.$$

If we compare this expression with the equivalent in the market equilibrium, Equation (20), we see that the denominator is necessarily larger. Hence, for any given g,  $n^G < n^M$ . It follows that  $g^G < g^M$ .

Notice finally that, as in the market equilibrium, the payments from apprentices,  $pa^G$ , and for children,  $pn^Gm^G$ , balance in the computation of the utility.

# I Proof of Proposition 6

We can compute the gains of adopting the guild institution as:

$$u^{\mathbf{F} \to \mathbf{G}} - u^{\mathbf{F} \to \mathbf{F}} = \gamma n_0 (y_1^{\mathbf{G}} - y_1^{\mathbf{F}}) + \kappa (a_0 - n_0) - \delta(a_0) + \delta(n_0) - \mu(N_0),$$
  

$$u^{\mathbf{C} \to \mathbf{G}} - u^{\mathbf{C} \to \mathbf{C}} = \gamma n_0 (y_1^{\mathbf{G}} - y_1^{\mathbf{C}}) + \kappa (a_0 - (n_0)^{o+1}) - \delta(a_0) + \delta((n_0)^{o+1}) - \mu(N_0).$$

 $\underline{N}$  makes people in the family equilibrium indifferent between adopting the guild or not, i.e., it solves:

$$\gamma n_0(y_1^{\mathsf{G}} - y_1^{\mathsf{F}}) + \kappa(a_0 - n_0) - \delta(a_0) + \delta(n_0) - \mu(\underline{N}) = 0.$$

One should show that for  $N_0 = \underline{N}$ , people in the clan equilibrium do not want to adopt the guild, i.e.:

$$\gamma n_0(y_1^{\mathsf{G}} - y_1^{\mathsf{C}}) + \kappa(a_0 - (n_0)^{o+1}) - \delta(a_0) + \delta((n_0)^{o+1}) - \mu(\underline{N}) < 0.$$

This is true if:

$$\gamma n_0 y_1^{\mathsf{c}} + (\kappa(n_0)^{o+1} - \delta((n_0)^{o+1})) > \gamma y_1^{\mathsf{F}} + \kappa n_0 - \delta(n_0). \tag{35}$$

Let us define the following function:

$$\psi(m) = \gamma n_0 u(m) + \kappa m n_0 - \delta(m n_0).$$

u(m) is the function that relates future income to number of masters learning from, in the context of the clan equilibrium. From (8) and (28), we get:

$$u(m) = \Gamma(1-\theta)^{1-\alpha} \left(\underbrace{(1+\nu)k - \nu k_{-1} + m\nu k_{-1}}_{\nu}\right)^{(1-\alpha)\theta} (N')^{-\alpha}.$$

Hence, u(m) is increasing and concave in m. As a consequence,  $\psi(m)$  is also concave in m ( $\delta(\cdot)$  is convex). To see whether it is increasing, we can compute:

$$\psi'(m) = \gamma \, n_0 (1 - \alpha) \Gamma(1 - \theta)^{1 - \alpha} \theta(k')^{(1 - \alpha)\theta - 1} \nu k_{-1} (N')^{-\alpha} + \kappa n_0 - \delta'(mn_0) n_0.$$

We also know from Appendix D that the clan equilibrium is sustained if the marginal cost paid to the master is less than the expected marginal benefit, i.e.  $\delta'((n_0)^{o+1}) - \kappa \leq \partial y_1^c / \partial m_0$ , which implies, from (32) and (8):

$$\gamma \theta (1-\alpha)\Gamma(1-\theta)^{1-\alpha} (k')^{(1-\alpha)\theta-1} \nu k_{-1} (N')^{-\alpha} + \kappa - \delta'(mn_0) \ge 0.$$

This individual level condition implies that, at the aggregate equilibrium,  $\psi'(m) > 0$ . Using the mean value theorem for derivatives, we know there exists  $\tilde{m} \in [1, m^c]$  such that  $(\psi(m^c) - \psi(1))/(m^c - 1) = \psi'(\tilde{m})$ . As  $\psi(\cdot)$  is concave,  $\psi'(\tilde{m}) > \psi'(m^c) > 0$  which proves  $\psi(m^c) > \psi(1)$  and inequality (35) holds.

 $\overline{N}$  makes people in the clan equilibrium indifferent between adopting the guild or not, i.e. it solves

$$\gamma n_0(y_1^{\mathbf{G}} - y_1^{\mathbf{C}}) + \kappa(a_0 - (n_0)^{o+1}) - \delta(a_0) + \delta((n_0)^{o+1}) - \mu(\overline{N}) = 0.$$

One should show that for  $N_0 = \overline{N}$ , people in the family equilibrium also want to adopt the guild, i.e.:

$$\gamma n_0(y_1^{\mathsf{G}}-y_1^{\mathsf{F}}) + \kappa(a_0-n_0) - \delta(a_0) + \delta(n_0) - \mu(\overline{N}) > 0.$$

This is true as  $\mu(\overline{N}) < \mu(\underline{N})$ .

# J Productivity Growth Calculations for Western Europe and China

Table 3 displays the data that underlie our calculations of aggregate productivity growth in Western Europe and China in the period 1–1820. We compute productivity based on the aggregate production function used in the main analysis with a TFP term  $A_t$ :

$$Y_t = A_t P_t^{1-\alpha} X^{\alpha},$$

where X = 1 is the fixed factor land (the normalization to one amounts to a choice of units) and  $P_t$  is labor supply, measured by population. Productivity can therefore be computed from data on population and GDP per capita ( $Y_t/P_t$ ) as:

$$A_t = \frac{Y_t}{P_t^{1-\alpha}} = \left(\frac{Y_t}{P_t}\right) p_t^{\alpha}. \tag{36}$$

As discussed in Section 5.1, the share of land is set to  $\alpha = 1/3$ . We do not explicitly account for physical capital, which was a relatively unimportant factor of production in the pre-industrial period, and at any rate no reliable long-term estimates of capital are available. Any changes in output that are due to physical investment would be reflected in measured productivity.

Voor	Donulation	CDD / sam	TED	A TED		
Year	Population	GDP/cap.	TFP	$\Delta TFP$		
Western Europe (Maddison 2010)						
1	18,600	600	159			
1000	19,700	425	115	-0.8%		
1500	48,192	797	290	4.7%		
1820	114,559	1,234	599	5.8%		
China (Maddison 2010)						
1	59,600	450	176			
1000	59,000	466	181	0.1%		
1500	103,000	600	281	2.2%		
1820	381,000	600	435	3.5%		
China (GDP/cap.: Broadberry et al. 2014)						
1000	59,000	1,382	538			
1500	103,000	1,127	528	-0.1%		
1820	381,000	595	431	-1.6%		

Table 3: Growth Accounting for China and Western Europe, 1–1820. Population in 1,000, income per capita in 1990 international dollars, TFP is computed according to (36) and divided by 100,  $\Delta$ TFP is growth rate of TFP in percent per generation (25 years).

The first two panels of Table 3 display population and income levels Western Europe and China from Maddison (2010). From 1 to 1000, the data imply slowly growing TFP in China and actually some regression in Western Europe. After 1000, there is an acceleration in productivity growth in both regions, but the rise in much more pronounced in Europe, with a gap between the regions of 2.5 percent per period until 1500, and 2.4 percent from 1500 to 1820.

Given the distant time periods involved, estimating income levels is naturally fraught with difficulty. As an alternative data source, we also consider the recent estimates of levels of income per capita by Broadberry, Guan, and Li (2014). The numbers are not always directly comparable to Maddison (2010) (e.g., Broadberry, Guan, and Li 2014 do not provide an average for Western Europe). The sources broadly agree on the measurement of population and on the acceleration of productivity growth in Europe, but there are large deviations in the estimates of levels of income per capita in China, which matter for the computation of growth rates. To generate an alternative

estimate of the gap in productivity growth between Western Europe and China after 1000, in the third panel of Table 3 we combine the population data from Maddison (2010) with the estimates of GDP per capita from Broadberry, Guan, and Li (2014). The estimates for GDP per capita in China in 1000 and 1500 (the year 1 is not available) are much higher compared to Maddison (2010), resulting in a decline in measured TFP over time. Based on these numbers, the gap in TFP growth between Western Europe and China per 25 years was 4.8 percent in 1000–1500, and 7.4 percent from 1500–1820.

A caveat in using these gaps in overall TFP growth to evaluate our model is that our model is primarily about productivity improvements in artisanal production, whereas agriculture made up the majority of the economy. This can be partly addressed by noting that there are important interactions between artisans and craftsmen and agricultural productivity, such as improvements driven by better agricultural implements, dairying techniques, millwrighting, and better storage, transport, and processing of agricultural products, which concerns a large number of crafts. In addition, some of the benefits of better dissemination of knowledge in Europe can be found in agriculture in altered form. One aspect of this is the prevalence in Western Europe of highly mobile servants, both male and female, who worked on farms other than those of their immediately family and may be contributed to the dissemination of new productivity improvements. The prevalence of mobile servants in Western Europe was due differences in family organization around the world (see Hajnal 1982) and did not have a close equivalent in China. Regarding other productivity improvements in agriculture, the key issue for our purposes is whether these were much different between China and Western Europe, i.e., whether the rise of Europe could perhaps be due primarily due to agricultural productivity rather than productivity in the crafts and ultimately manufacturing. The data to settle this question definitively does not exist, but our reading of the existing evidence is that at the very least improvements in the sectors that we focus on here played a very important role. Within agriculture, the main drivers of productivity were new crops and better cultivation methods. With regards to crops, an important factor was the introduction of new crops from the New World after Columbus, which occurred in both Europe and China. With regards to cultivation, Europe gained from the introduction of fodder crops and the closer integration of the pastoral and arable sectors in the "new husbandry," and China gained from the spread of double-cropping. What we think is beyond any question is the well-documented growth in the productivity of pre-Industrial Revolution (artisanal) manufacturing in Europe in a wide range of industries, from high-skilled instrument and clock making to ironworking and textiles. This was simply not matched by anything we see in China.