Tariffs and Trees: The effects of the Austro-Hungarian customs union on specialization and land-use change

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Abstract

This paper examines the impact of the 1850 Austro-Hungarian customs union on production land-use outcomes. Using newly digitized data from the Second Military Survey of the Habsburg Monarchy, we apply a spatial discontinuity design to estimate the impact of trade liberalization on land-use. We find that the customs union increased the cropland by 8% per year in Hungary between 1850 and 1855, while forestland decreased by 6%. We provide suggestive evidence that this result is not confounded by the emancipation of the serfs, population growth, or technological change in agriculture.

JEL codes: O13, Q56, N74, N53
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Introduction

There is little debate that trade liberalization generates economic gains, however, empirical assessments of the underlying shifts in production in response to the agreements that liberalize trade are scarce.[1] The presence of reverse causality or omitted variables that may drive both changes in production and the timing of trade agreements presents a key challenge to understanding the causal effect of these agreements on production. This paper circumvents this problem by drawing on a natural experiment from the first wave of globalization − the Austro-Hungarian customs union of 1850 − to examine the impact of trade liberalization on land-use, a proxy for production. Before 1850, Hungarian exports to Austria were taxed at approximately half the rate of other foreign goods. In 1850, the elimination of all tariffs between Austria and Hungary established the Habsburg customs union. We ask whether the 1850 agreement changed land-use patterns in a way that suggests increasing specialization, as classical trade theory would predict. That is, did trade liberalization in the Habsburg Monarchy lead to changes in the spatial distribution of agricultural production? Furthermore, do we see long-run effects of any change in specialization?

[1] See Arnaud Costinot and Andres Rodriguez-Clare (2014) for a review.

To answer these questions, we exploit a new dataset comprised of a sample of digitized points from the Habsburg Monarchy's Second Military Survey (Munteanu et al., 2015). Using a 2 km x 2 km grid of points overlaid onto the military survey, each point is assigned the unique land-use category from the underlying map in the year that the map was produced, as well as a host of geographic characteristics associated with that point in space. Although this dataset provides only a snapshot of land-use during the survey, the data collection process resulted in time variation across space because survey dates range from 1819 to 1873. This variation in mapping dates generates a temporal discontinuity in space that we exploit here in order to identify the impacts of the trade agreement. Specifically, we compare points mapped the decade after 1850 with those mapped the decade before, while limiting our analysis to those points closest to the spatial-temporal break in mapping in order to minimize geographic differences.[2] Using district fixed effects in this setting restricts variation to changes in land-use before and after 1850 within a given district, thereby controlling for time-invariant administrative characteristics that may affect production. Additionally, we control for global trends and a variety of geographic covariates likely to independently affect agricultural productivity, including soil quality, ruggedness (Nunn and Puga, 2012), and proximity to cities and rivers.

We find that the probability of observing agricultural land after 1850 decreases in Austria and increases in Hungary. The average post-1850 effect is an annual increase of 8% in the presence of agricultural land-use in Hungary. We also observe annual decreases of 6% in the presence of forest and natural grasslands in Hungary. The results are consistent with specialization in agricultural production on the Hungarian side of the Austria-Hungary border. Our results are robust to varying the width of the discontinuity, allowing for differential slopes on either side of the discontinuity, and using a sub-sample of districts containing observations both before and after 1850. We also calculate the level of correlation between our impact estimate and potential omitted variables that would be necessary to overturn our results, and find it unlikely that the results would be nullified. Further, we discuss how the potentially confounding effects of the emanci-

[2]No single point was mapped twice. Instead, we observe points mapped before and after 1850 that are within a given geographic bandwidth of one another. We explore bandwidths of 40 km, 30 km, and 20 km in our empirical analysis.

pation of serfs and advances in agricultural technology during the same period might impact our estimates. A placebo test examining trends in land-use prior to 1850 shows no anticipatory changes in land-use behavior. Additional evidence that trade is the mechanism driving the result is the fact that the majority of the effect is observed in areas that are within two days travel of the border between Austria and Hungary, where we would expect the strongest impact of the agreement.

The contributions of this paper are both topical and methodological. Primarily, our work speaks to the historical debate surrounding the causal impacts of the customs union. Throughout the historiography of the Habsburg Monarchy, assessments of the customs union's effects have ranged from condemnation for having relegated Hungary to colonial status to outright praise.[3] Specifically with regard to trade, Scott Eddie (1972, 1977, 1989) documents evidence of specialization and interdependence between Austria and Hungary in the latter part of the 19th century, arguing that the terms of trade served as a tax on Hungarian agriculture. Since the 1980s, however, the prevailing narrative in the literature is that the customs union had little-to-no effect on production and economic growth throughout the Monarchy. This is based on the argument that Austrian industrialization was underway prior to the customs union and that the tariff wall was low vis à vis the rest of Europe, such that patterns in Hungarian trade and agricultural production did not change significantly after tariff barriers were reduced (Komlos (1983); see David F. Good (1984) for a discussion). More recently, work by Max-Stephan Schulze (2000, 2007), building on estimates from David F. Good (1978), Anton Kausel (1979), and David F. Good and Tongshu Ma (1998), shows that between 1870 and 1910 Hungary's economy grew at a markedly faster rate than Austria, and that this growth was primarily driven by advancements in the agricultural sector. Schulze, however, makes no assertions that the customs union is responsible for these trends.

The present paper contributes to this narrative by using a disaggregated dataset that allows us to test whether or not the customs union impacted the Habsburg economy. The spatial disaggregation of our data allows for the generation of a locally plausible counterfactual, while the temporal focus around the immediate period before and after the customs union (1840-1860)

[3]See John Komlos (1983) for a discussion.

rules out long-run trends that potentially confound the results in other studies. Specifically, we are able to examine how factors of production − namely, land − adjusted in response to a reduction in trade barriers. Our results show higher allocations of land to agriculture in Hungary after 1850. This finding is consistent with the interdependence in trade between Austria and Hungary observed by Eddie (1989) and the rapid growth of the agricultural sector in Hungary estimated by Schulze (2000, 2007) in late 19th and early 20th centuries.

Our work also speaks to the literature related to empirical applications of classical trade models.[4] Many of these studies test the relationship between comparative advantage−measured by relative labor productivity differences across industries−and exports, relying on cross-sectional analysis, as well imputed measures of trade openness.[5] Classical trade models are difficult to test because they require data on goods that have been driven out of production by trade, making it hard to find a proper counterfactual.[6] While we are not primarily concerned with examining the relationship between factor productivity and exports, or formally testing the theory of comparative advantage per se, we are able to examine adjustments in the factors of production as expressed through land-use before and after trade is "opened". Our findings are consistent with predictions on specialization that arise from classical trade models.

Lastly, our empirical approach is novel within the broad set of trade applications. Whereas

[4]See Arnaud Costinot, Dave Donaldson, and Ivana Komunjer (2012) for an excellent and more recent application, as well as G. Donald MacDougall (1951); Robert M. Stern (1962); Bela Balassa (1963); Stephen S. Golub and Chang-Tai Hsieh (2000); Daniel M Bernhofen and John C. Brown (2004) for more traditional applications. In addition, a growing literature based on the Jonathan Eaton and Samuel Kortum (2002) model extends the discussion to a multisector environment.

[5]For instance, Stern (1962); Balassa (1963); Golub and Hsieh (2000) use the overall export ratio in order to account for trade barriers.

[6]A few studies have been successful in finding appropriate counterfactuals. Arnaud Costinot and Dave Donaldson (2014) use agronomic data on predicted output by crop to structurally estimate a Ricardian trade model for crop markets in 1,500 US counties from 1880 to 1997 and find significant long-run gains from economic integration. Costinot et al. (2012) develop a theoretical model that yields counterfactual predictions, allowing for empirical tests of the Ricardian model that are theoretically founded. Daniel M Bernhofen and John C. Brown (2004) directly test the theory of comparative advantage using Japan's opening up to international trade in the 1860s as a natural experiment.

much of the existing literature uses aggregated census data to present general summary statistics and correlations, our paper uses spatially disaggregated data that gives insight into land-use changes at a micro level. We contribute to the small but growing set of papers using spatial discontinuities to analyze phenomena in economic history and trade (Becker et al., 2016; Egger and Lassmann, 2015; Grosfeld and Zhuravskaya, 2015; Schumann, 2014; Basten and Betz, 2013; Grosjean and Senik, 2011; Michalopoulos and Papaioannou, 2014; Dell, 2010), as well as illustrating the value of historical maps in elucidating economic decision-making. The Habsburg Military maps have been used in small case studies of land-use change in particular areas of the Carpathians (Konkoly-Gyuró, 1991, 1995, 2003; Kozak, 2003; Nagy, 2008a,b,c; Ostafin, 2009; Munteanu et al., 2014) but rarely in broad-scale analyses.[7] The large archive of available maps provides a rich dataset that can be used to identify important economic and environmental trends at a key period in the history of economic development − trends that are likely to have had long-lasting effects. We hope our work encourages other scholars to contribute to the effort to digitize and understand this source of information.

Background and framework

Reforms enacted by Maria Theresa in the late 18th century eliminated tariff barriers between the Austrian regions of the Habsburg Monarchy, forming the largest free trade area in Europe at the time, to the exclusion of the Kingdom of Hungary (Komlos, 1983).[8] Although Austria and Hungary acted as one in foreign and military affairs, and even had a common currency, trade restrictions between the two regions of the Monarchy persisted well into the mid-19th century.

The tariff wall consisted of a complicated structure of import and export taxes on various goods exchanged between the two regions. The consensus in the historical literature is that these levies, while potentially inhibiting to trade, were preferential relative to extra-imperial tariffs

[7]For exceptions, see Munteanu et al. (2015), Kozak (2003), and Oleksandra Shandra and Peter Weisberg and Vazira Martazinova (2013).

[8]We use the Komlos (1983) definition of Austria, denoting all the lands represented in the parliament at Vienna after 1867, in spite of our use of the term prior to 1867. Similarly, we refer to Hungary as the Kingdom of the Crown of St. Stephen, including Croatia and Transylvania (Komlos, 1983).

(Komlos, 1983; Good, 1984). For instance, in the 1830s and 1840s, Hungarian wheat exports to Austria were charged a 7.5% tax, while foreign wheat paid 10.0%. On average, Hungarian goods imported into Austria were taxed at half of the rate levied on foreign goods. Imports of Austrian manufactures into Hungary were taxed considerably less at 3.5%, while Hungarian wool entered the Austrian market virtually duty free (Komlos, 1983).

Because the Austrian Constitution prohibited internal trade restrictions, the tariff wall between Austria and Hungary dissolved when Hungary was formally incorporated into the Austrian Empire after the failed revolutions of 1848 (Eddie, 1977). 1850 marks the official creation of the customs union, but the years just prior to 1850 and the following two decades (roughly, 1848 to 1873) are generally known as a period of political and economic liberalization throughout the Monarchy (Eddie, 1977; Komlos, 1983; Good, 1984). Internally, reforms included the emancipation of the serfs in 1848, the establishment of a central bank, and the abolition of the guild system in 1859 (Eddie, 1967). Externally, Habsburg trade liberalization followed European trends during this era, engaging in tariff reductions and "liberal treaties" with England and Germany, which limited Austrian-specific duties and ad valorem taxes. The most notable of these are the tariff reductions of 1851, 1853, and 1865, the 1865 treaty with England, and the "Supplementary Convention" of 1869 which limited Habsburg-specific duties to agreed maximum ad valorem levels (Eddie, 1977).

Ricardian trade theory predicts that countries specialize in the production of goods in which they have comparative advantage. Differences in production technologies or factor endowments make labor relatively more or less efficient in the production of certain goods, such that with the opening of trade countries specialize in the goods that they are relatively more efficient in producing (Costinot, 2009). Throughout our analysis we assume that Hungary has the comparative advantage in agricultural goods, while Austria has comparative advantage in forest and manufactured goods. Online Appendix Figure E1 illustrates that Hungary has a lower relative price for wheat (relative to wood) in the years prior to the customs union.

A simplified Ricardian framing predicts that after the customs union of 1850, Hungary should exchange agricultural goods for manufactured goods. To extend the prediction to land-use, in the absence of significant and differential technological change in the years following the customs

union, we expect more land to be be allocated to agriculture in Hungary and less in Austria. Due to a lack of disaggregated trade data for the Habsburg Monarchy, we can not examine goods, specifically. Instead, we use highly disaggregated data on land as a production indicator, and examine trends in land-use after the opening of trade. To support our analysis, we also explore aggregated trade and production statistics, which are not suited for formal analysis, but do support the trends found in our data.

We first present summary statistics in Table 1 illustrating the interdependence and specialization in trade between Austria and Hungary over time. Ideally, we would like to examine trends in the data before and after the customs union. Unfortunately, however, while trade data for Austria is available in the period prior to the customs union, reliable data for Hungary only exists from the 1880s onward (Eddie, 1989).[9] However, the data in Table 1 show clear patterns of interdependence and specialization between the two regions in the period between the 1880s and early 1900s – 30 years after the establishment of the customs union. Panel A indicates that Austria sustained a trade deficit with Hungary in agricultural goods (field crops, sugar, and flour) and a surplus in manufactured goods (fibres and textiles), which steadily increased from 1884 to 1913. Moreover, when we examine each partner's share in the other's trade as a percent of the total value of imports and exports, similar patterns emerge. Panel B shows that the Austrian share in the value of Hungarian agricultural exports was 70.1 percent in the period between 1884 and 1888, increasing to 80.0 percent between 1909 and 1913. Over the same period, the Austrian share in the value of Hungarian agricultural imports declined from 50.9 percent in the period between 1884 and 1888 to 28.5 percent between 1909 and 1913. Hungarian imports of manufactures came almost entirely from Austria, whereas the Austrian share of Hungarian imports declined slightly from 94.9 percent in 1884-1888 to 89.3 percent by 1909-1913. Moreover, Hungary was

[9]Intra-regional trade statistics in the period before the customs union only present information on Austria's trade with Hungary and the outside world (complete data trade data for Hungary does not exist for this period). Moreover, imperial trade data in the period immediately following the customs union do not exist. Specifically, no Hungarian data was collected from 1850 until the beginning of the Dual Monarchy in 1867. Moreover, data on Hungarian trade with Austria and the outside world are considered to be incomplete and suspect through 1881, the year that the statistical office in Hungary was reformed (Eddie, 1977).

the principle export market for Austrian manufactures, with the Hungarian share in the value of Austrian fibres and textiles exports representing 65.0 percent in 1884-1888, declining slightly to 58.7 percent by 1909-1913.

TABLE 1 HERE.

The observed changes in flows of goods are consistent with the production data from 19th century Habsburg statistical records.[10] Figure 1 below shows per capita production over time averaged across provinces in Austria and districts in Hungary, and fitted across time with a second degree polynomial. Two things are evident from these figures. First, there is no information on production between 1854 and 1872. Therefore, a contribution of our work is that we show changes in production indicators during this period. Second, the data that do exist show increased productivity (output per capita) in Hungary relative to Austria, particularly for wheat and barley, in the post-customs union period.

FIGURE 1 HERE.

While summary statistics using aggregated data are illuminating, they suffer from significant measurement error, a high proportion of missing observations in key years, and the fact that identification of specialization relies on comparing differences in time trends across large areas, whose counterfactuals are time trends in very different places in Austria. Recent work by Schulze (2000, 2007) carefully constructs per capita GDP measures for Austria and Hungary from 1870 to 1913, taking into account physical and human capital stock and growth. The data show that, consistent with the trends above, the agricultural sector was far more productive in Hungary than in Austria and was the main driving force of Hungarian economic growth between 1870 and 1913 (Schulze, 2000, 2007). Linking these trends with the creation of the customs union requires counterfactuals over time and across nearly identical geographic spaces. We examine disaggregated data in order to compare places with similar geographies and observe tradeoffs in key land-

[10] *Tafeln zur Statistik der Österreichischen Monarchie* (Austria, Statistisches Central-Comission, 1865), *Statistisches Jahrbuch der Öesterreichisch-Ungarischen Monarchie* (Austria, Statistisches Central-Comission, 1881), *Östrreichisches statistisches Handbuch fur die im Reichsrathe vertretenen Konigreiche und Lander* (Austria, Statistisches Central-Comission, 1914), *Magyár Statistikai Közlemények* (Országos Magyar Kir, 1911) , and *Magyár Statistikai Évkönyv* (Országos Magyar Kir, 1918).

uses. In addition, the spatial detail of our data allows us to exploit heterogeneity that can reveal the mechanisms through which production evolved over the last half of the 19th century.

Data and methodology

The main source of data for this study are maps from the Habsburg Monarchy's Second Military Survey, which took place from 1806-1869 (Timár et al., 2006). The First Military Survey occurred from 1763-1785 after the failed Seven Years War (1756-1763). Because the first survey expedition was plagued by a lack of precision, the Second Military Survey used more sophisticated cartographic techniques. It is important to bear in mind that the primary purpose of the Second Military Survey was just that – military. The Monarchy was under constant threat from outside incursion, and it was clear from the late 18th century that the Habsburgs saw mapping as an essential input into military organization. The maps produced by the military engineers were highly secretive – the results of the First Military Survey, for example, were kept hidden until the 1850s (Veres, 2015, 154), and public access to successive military surveys was also forbidden.

Even though the Second Military Survey was not designed to assess production (unlike cadastral maps), it provides detailed information on land-use patterns across the region, and is the oldest reliable dataset providing wall-to-wall land-use data (Munteanu et al., 2014, 2015). The Second Military Survey also represents a major achievement in scientific and political knowledge. Building on the 19th century revolution in mathematics and science, it spurred the creation of a tremendous infrastructure for mapping, including building an engineer corps, astronomic observatories, map archives, and the regularization of practices across a diverse set of surveyors and mappers (Veres, 2015).

The study region encompasses what is known as the Carpathians Region of Eastern Europe, and includes parts of the modern-day countries of Hungary, Poland, Slovakia, Romania, Ukraine, Czech Republic, and Austria. The underlying maps are at very fine scale – 1:28,000 (each centimeter on the maps represents .28 kilometers). Complete digitization at this scale would have been prohibitively costly. Therefore, we did not digitize all the information in the maps, but

rather a sample of points at the vertices of a 2-kilometer resolution grid over the entire study region, which contained around 80,000 data points. Each point in our sample grid was assigned the land-use classification from the point on the map directly below it (points have no area). Online Figure E2 illustrates an overlay of the grid, the sampled points, and a small part of the underlying historical map.

The land-use classifications used in this paper include crops, pasture, forest and natural grasslands, wetlands, and urban land, although some of the maps had more extensive divisions. The classification represents categories that are both available across all maps and that roughly correspond to categories of production. We conduct our estimations on crops, pasture, and forest and natural grasslands because these are most closely related to traded production, and because observations of the other possible categories – wetlands and urban land – are scarce in the data and estimations are unlikely to be robust. The classification process and resulting dataset is described in Munteanu et al. (2015). Because each point is classified into a unique land-use category, the outcomes that we analyze are binary.

GIS software was used to calculate for each point the following characteristics: slope, elevation, distance to nearest city, distance to nearest river, and whether or not the land had agricultural limitations according to the European Soil Database (ESDB, 2004). These limitations are determined by the scientists who created the ESDB. Some of the 17 possible agricultural limitations are: gravelly (over 35% gravel), stony (presence of stones $>$ 7.5 cm, impracticable mechanization), lithic (hard rock within 50 cm), glaciers and snow-caps, frangipans, and excessively drained. The overlay of the points with district boundary maps from the Habsburg Monarchy provides boundary identifiers as well as distance to the Austria border. Finally, the statistical yearbooks of the Monarchy give population totals by district within Hungary for the years 1840, 1846, 1851 and 1857.[11] We use these totals to calculate approximate population densities in the districts that we use for estimation, assigning the population density of the year closest to the year in which a point was mapped. Basic means and variations are shown in online Table A1. Across the entire sample, the two dominant land-uses are forest/grasslands and crops.

The main innovation of this paper is to exploit the variation in the timing of mapping to try

[11]Sources listed in footnote 10.

to isolate the effect of the customs union on land-use. Figure 2 illustrates the temporal variation in the mapping process. The earliest mapping was clearly very strategic, focusing on the industrial and mining regions near the northern border, and then moving south and east.

FIGURE 2 HERE.

The variation in mapping dates across space allows us to employ a spatial discontinuity design, where the discontinuity in space proxies for a temporal discontinuity. This strategy is different than a standard spatial discontinuity approach, which usually measures the differences between "treatment" and "control" observations at the same point in time, but on different sides of a spatial treatment threshold (for example, an administrative boundary, as in Melissa Dell (2010)). In our case, the "treatment" is time itself, since we are interested in the impact of a policy that has only temporal and not spatial variation. Ideally, we would like to analyze the same set of mapped data points before and after 1850 within Hungary and within Austria. However, since no single point was mapped both before and after 1850, we instead examine points that are arbitrarily close in space, but were mapped at different years. The timing of the map dates allows us to draw a line across space that represents a temporal discontinuity. The underlying assumption is that two points within a bandwidth of the 1850 mapping line are similar in their key determinants of land-use (for example, soil quality, slope, elevation, etc.), and that the placement of the line contains some element of random variation.

The non-random nature of mapping in general makes it difficult to argue time is uncorrelated with key determinants of land-use, such as the inherent agricultural productivity of land. In order to assess whether or not the timing of mapping was related to agricultural productivity, we examine the distribution of mapping years for land with no agricultural limitations and land with some agricultural limitations. Figure E3 of the online Appendix demonstrates that there was some tendency to map land with no limitations (better land) earlier, although it is also clear that for almost all time periods, both types of points exist. This means that when we run a regression that controls for whether or not a point has limitations, there are always sufficient observations to make comparisons across land of different qualities. Furthermore, if it is the case that the government mapped more productive lands first, then average agricultural productivity would decrease with the time variable in our sample. Given that more productive land is more likely to be

used in agriculture, if we then compare land-use before and after 1850, the fact that land mapped after 1850 is slightly less productive means that in the absence of any policy change, we would be more likely to observe decreases in the presence of agricultural land-use over time. If the policy causes agricultural production to increase, then our estimation is likely to understate this impact.

To limit the impact of variation in underlying geophysical characteristics that affect land productivity across space, our main strategy exploits the immediate areas along the line of maps before and after 1850. Figure 3 highlights the potential areas of analysis. The light grey areas in the figure indicate maps made before 1850, and the dark grey areas maps made after 1850. The black rectangles highlight two potential potential sources of variation: in Austria, before and after 1850, and in Hungary, before and after 1850. We will focus our analysis on the latter because this area has a sufficient number of districts within which there is temporal mapping variation. Discontinuity 1 provides only qualitative results, since Austria had only one district, Moravia, that was mapped before and after 1850.

FIGURE 3 HERE.

Our sample is defined by the region with maps created between 1840 and 1860, and within 40 kilometers of the discontinuity. The location of these maps is indicated by the rectangles on the map. We also check the robustness of this distance by using windows of 30 and 20 kilometers. By focusing on a narrow band of land around the mapping dates of interest, we hope to minimize geographic differences that might drive large scale changes in measured land-use across space, as would occur, for example, if we compared lowlands, mapped in the earliest survey years, with high mountain vegetation of the Carpathians, which were mapped in the latest years of the survey. This approach is similar to recent papers with a European focus by Peter H. Egger and Andrea Lassmann (2015) and Pauline Grosjean and Claudia Senik (2011), who use spatial discontinuities with analysis windows of 50 and 25 kilometers, respectively.

The key outcomes are land-use dummy variables (y_{ik}) for point i in district k: crops, pasture, and forest. The identification of the impact of the customs union comes from a combination of an indicator variable equal to one if mapping was done after 1850 and zero otherwise (D_{ik}), and its interaction with a linear time trend set to zero at 1850 (T_t). The estimation also contains a vector of control variables $\mathbf{X_{ik}}$, the elements of which are ruggedness, agricultural potential, distance

to nearest river, distance to the Hungarian border, and distance to the 1850 discontinuity line. We also include a quadratic of distance to the 1850 discontinuity ($x_i(d)$), as well as district fixed effects (γ_k).[12] In some specifications we also include the log transformation of the approximate district/year population density. The standard errors (ϵ_{ik}) are clustered at the district level. The basic estimation equation is thus:

$$y_{ik} = \alpha_0 + \alpha_1 D_{ik} + \alpha_2 D_{ik} T_t + \alpha_3 T_t + \beta \cdot \mathbf{X_{ik}} + \omega x_{i(d)} + \gamma_k + \epsilon_{ik} \quad (1)$$

All of the outcomes are binary, and we estimate this equation as a linear probability model using OLS.[13] The key assumptions underlying a causal interpretation of α_2 are: (1) that individuals could not manipulate their position on either side of the temporal discontinuity and (2) that, conditional on controlling for smooth measures of distance and time, there are no omitted variables that are changing in the same way as $D_{ip}T_t$ and thus driving the result. These are equivalent to the assumptions required for a standard regression discontinuity design (Lee and Lemieux, 2009), and we present evidence that they hold in the following section.

Because our discontinuity is both spatial and temporal, we require that individuals did not change their behavior in anticipation of mapping. Anticipatory behavior alone should not be problematic if it is similar across time periods – for example, if people always anticipated that they would have improved tenure after mapping. However, it could threaten the identification strategy if the reasons for this anticipatory behavior were changing over time. The secretive nature of the mapping (discussed above) minimizes our worries about this problem. Furthermore, cartographic history of the Habsburg Military Surveys definitively establishes that the maps were made by a highly trained corps, that they were of predetermined sizes, and that more militarily sensitive areas were mapped first (Veres, 2015). The starting reference point for mapping was Vi-

[12] We chose the quadratic form because it resulted in the best fit of the data in a regression of the residual variation in agricultural land after controlling for all of our other covariates. We compared the fit across linear, quadratic, third order polynomial and the log-transformation of distance to the discontinuity.

[13] We make this choice for three reasons. First, Probit/Logit can suffer from bias when error terms are heteroskedastic; second, the OLS model allows us to use fixed effects without losing observations; and third, we can easily apply the correct error structure (clustered and bootstrapped).

enna (Timár et al., 2006). Because map sheets within Hungary were uniform in size, the location of the edges of these sheets is exogenous to local conditions. However, it could still be the case that mapping of an entire sheet was accelerated or slowed by local conditions. Because of this uncertainty, the robustness checks section presents a variety of robustness checks, including a test for anticipatory behavior and an estimation of the necessary correlation of an omitted variable that might overturn our results.

Discontinuity Summary Statistics

We begin by presenting graphs of one of the key outcomes in our data – the change in seasonal crops over time across our two within-country discontinuities. The vertical axis on the right side of Figure 4 shows the average values of outcome variables in Hungary and Austria, together with smoothed polynomial regressions estimated separately over the pre- and post-1850 periods for Austria (figure a) and Hungary (figure b). The bars, which correspond to the vertical axis on the left side of the figure, show the density of the data (the relative frequency of observations) for each year. The figures are consistent with the predictions: agriculture decreases in Austria and increases in Hungary, and it appears that the increases may be increasing over time (figure b).

FIGURE 4 HERE.

The figures highlight the weakness of the data for the within-Austria (Moravian) sample. In Austria, in addition to having all the data located in one province, there are very few years of observations after 1850. Because there is no provincial level variation in our Moravian data, and also because of the limited post-1850 data, we take these results as merely suggestive.

Trends in aggregate statistics for Austria, which record increases in forest and crop land over the time period that we study, seem to potentially conflict with our findings in Figure 4 (Sandgruber, 1978).[14] However, while the Sandgruber (1978) data is generally respected for its accuracy and scope, specific statistics pose challenges because they: a) have been aggregated from various sources with little explanation of the methods and assumptions used to aggregate the data, b) are available at only five discrete points in time,[15] c) cannot take into account varia-

[14] We refer the reader to tables 79-85 in Roman Sandgruber (1978).

[15] According to the footnote in Table 79, land-use data was aggregated from the following sources:

tion in land quality, and d) may confound global trends with local causality. Nonetheless, we attempt to reconcile our suggestive findings with existing data sources by exploring land-use trends for Austria using aggregated data available in the Habsburg statistical yearbooks.[16] While these data also suffer from some of the same problems as the Sandgruber (1978) data, there is potential insight to be gained from examining trends over a more years of data.

We fit quadratic polynomials to the data for Austria and for Moravia between 1830 and 1880 and examine trends in cropland and forested areas as a proportion of total provincial area. We expect to see a break in land-use trends before and after 1850. Note, however, that a classic regression discontinuity approach requires large samples around the discontinuity, which are not available in the aggregated yearbook data.[17] With this caveat in mind, the results presented in Figure E6 of the online Appendix show no significant break in trends for crop or forested land around 1850 for Austria as a whole or for Moravia. In fact, they show almost no variation at all (note the limited range of the y-axis). We interpret these findings as evidence of the difficultly in precisely estimating the impact of the customs union without a proper counterfactual or highly disaggregated data. Taken together with our suggestive evidence for Moravia in Figure 4 we conclude that, at the very least, there were likely heterogeneous impacts of the customs union throughout Austria that are difficult to measure without detailed data.

Josefinischer Kataster; Franziszeischer Kataster, Definitiver Kataster; Revision 1897; Tafeln zur Statistik 1828; Tafeln zur Statistik des Steuerwesens; Hain, Hanbuch der Statistik; Fillunger, Vergleichende Statistik; Statistisches Jahrbuch der Öesterreichisch-Ungarischen Monarchie, Östrreichisches statistisches Handbuch fur die im Reichsrathe vertretenen Konigreiche und Lander; and Hassel, Neueste Erdbeschreibung. Tables 79-85 display data for each province of Austria, as well as in total, in the years 1789, 1830/50, 1883, and 1897.

[16]Specifically, we use data listed in the tables for "Productive Bodenfläche der Länder nach den Haupt-Culturarten" available in the *Tafeln zur Statistik der Österreichischen Monarchie* (1831-1865) and *Statistisches Jahrbuch der Öesterreichisch-Ungarischen Monarchie* (1872-1881).

[17]In order to be consistent with the discontinuity approach to our map data, we should set the discontinuity window to be between 1840 and 1860. This, however, would only give us 13 provinces over 11 years of data, due to significant missing data around 1850. We therefore extend the window to be between 1831 − the earliest year for which we could access the historical yearbooks − and 1880. This provides 13 province observations over 34 years.

In addition to the visual discontinuities presented in Figure 4, we examine the summary statistics of outcomes and covariates across the temporal discontinuity within Hungary. Table 2 shows means, variances, and normalized differences across the 1850 cut-off for both the full sample of points (columns (1) and (2)) and the sample that is restricted to within 40 kilometers of a discontinuity (columns (4) and (5)).[18] The table also contains normalized differences of outcomes and covariates across the discontinuity (columns (3) and (6)).

We observe slight decreases in the proportion of cropland and forest (Table 2), and increases in pasture and wetlands in the full sample. When we limit the sample to the discontinuity (columns (4) and (5)) we observe much less variation across covariates – for all control variables, the normalized differences between covariates in the before and after 1850 sample decrease substantially. In addition, in the discontinuity subsample, cropland now appears to increase substantially over time in Hungary rather than decrease.

TABLE 2 HERE.

Within the discontinuity sample there are some small differences in observable covariates – the after points are in somewhat more rugged places, are farther from the nearest city, and less likely to have agricultural limitations. Because of our discontinuity strategy, it is important that we assess whether there are jumps in key covariates at the discontinuity threshold that indicate that there might be omitted variables driving the result. Table 3 shows the same regression specification that we employ for our main results, substituting as dependent variables some of the key covariates included in the estimation: if the point has no agricultural limitations, ruggedness, and proximity to the nearest city (1/(km to nearest city)). The "post-union" variable then measures if there is a discrete jump in the value of this variable, conditioning on all the other covariates in the regression, and the interaction between post-union and time assesses whether or not the slope of the covariate also changes systematically across time after the establishment of the customs union. Out of the three outcomes, only proximity to nearest city is marginally significant after 1850. In particular, there is a positive and marginally significant coefficient on the interaction

[18] In this setting, where sample sizes are very large, normalized differences provide greater insight into variation across the samples, since normalized differences are independent of n and highlight the magnitude of difference.

between post-union and time. However, the magnitude of this effect is quite small – less than 1/10th of a standard deviation of the proximity to city measure.

TABLE 3 HERE.

Estimation results

In Table 4 we show estimations for our main subsample, using the specification given in equation (1). There are significant and fairly large increases in cropland and decreases in forest/grasslands, while changes in pasture area are not statistically different from zero. The precision of the estimates increases with the addition of covariates, but does not substantially change their magnitude. For crops, the point estimate of 0.031 for the coefficient on the interaction between years since 1850 and the post-1850 indicator variable, relative to the baseline of 0.38 (column (4) of Table 2), implies that after 1850 crop area increased by 8% per year. The parallel impact on forest presence is about 6% given the baseline of 0.39.[19] Table 5 presents the results with standard errors clustered at the district level. Our small number of clusters (23) is somewhat problematic. However, when we estimate the standard errors using wild-bootstrap clustering (Cameron et al., 2008), we find equivalent significance levels (95% confidence intervals shown in square brackets in table).

TABLE 4 HERE.

[19]Land tenure institutions will have an impact on land-use changes. For instance, open access forests are managed differently from common property resources or private property. However, in order for land tenure to confound our results, land ownership structures would need to differ across our discontinuity in Hungary, which we believe is unlikely, given the narrow bandwidths of 40 km, 30 km, and 20 km that we set around the discontinuity. Unfortunately, there is no information on land tenure in the historical maps or statistical yearbooks. Work by Eddie (1967) discusses tenure in Hungary between 1867 and 1914 (after our study period), and notes that the vast majority of land was held privately. As of 1867, one-quarter of land in Hungary was held in mortmain, with 81% of this land owned by the entailed estates of the nobility, the State, and towns. Specifically with regard to land owned by towns (52% of all mortmain land), Eddie (1967) notes that these lands typically surrounded the inhabited part of the town and were often not cultivated.

We interpret these findings as causal evidence of the effect of the customs union on promoting specialization in agriculture in Hungary. To extrapolate these findings into evidence of changes in productivity from a reduction in trade barriers would require us to make assumptions about the relationship between land, capital, and labor that are beyond the scope of this paper. Nonetheless, in the event that agricultural yields remained the same or increased due to technological progress, these estimates could represent a lower bound for the increase in production resulting from the customs union. However, they might also overstate the impact if it is the case that the extensification of agriculture resulted in moving production to land with lower inherent productivity. To assess whether or not this is the case, we examine the distribution of our inherent land productivity variable by year, for the land which was classified as agricultural in our sample during the post-union period. We observe that generally, agricultural land tends to fall into the category of having "no agricultural limitations", and that if there is any time trend in this variable at all, it appears that higher quality land is coming into production over time (see Figure E5 in online Appendix).

At first glance, the results in Table 4 seem at odds with previous findings in the literature, namely Komlos (1983) who argues that Hungarian per capita grain production did not differ quantitatively before and after 1850.[20] Rather, Komlos argues, increased demand by Austrian consumers was the primary determinant of the growth in Hungarian grain production between 1828 and 1870 (Komlos, 1983). However, due to the aggregated nature of the data, one may wish to intrepret Komlos' findings with caution.[21] Nonetheless, the argument that demand from Aus-

[20]Komlos (1983) calculates per capita growth rates in grain production for Hungary and Austria across the following time periods: 1789-1841, 1850-1868/70, 1868/70-1881/83, and 1881/83-1911/13, and shows that in Hungary, the growth rate of per capita grain production declined slightly between the 1789-1841 and 1850-1868/70 periods from 0.9 to 0.6 percent, and increased substantially to 3.4 percent between the 1850-1868/70 and 1868/70-1881/83 periods.

[21]Komlos (1983) compiles data that has been aggregated across large regions and over various time periods from a number of sources (see Table 2.6 on p. 59). In addition the data that is used to calculate trends before 1870 is for grains (which we interpret to mean wheat, rye barley, oats, and maize), while the growth rates after 1870 include all plant production, making long-run comparisons in trends akin to comparing apples and oranges.

trian consumers drove production patterns in Hungary does not contradict our findings. Prior to the customs union, Hungarian wheat imports to Austria were taxed at 7.5%, making a reduction to 0.0% not an insignificant change. After 1850, Hungarian agricultural exporters were in an improved position to access increasing demand in Austria that was less accessible to foreign competitors, due to the high external tariffs surrounding the Habsburg customs union (Schulze, 2007). It is therefore entirely possible that increased demand from Austria compounded the effect of a reduction in trade barriers on promoting growth in Hungarian agriculture.

Taken at face value, the Komlos' (1983) estimates do show a marked increase in the growth rate of per capita agricultural production in Hungary between 1869 and 1883, which Komlos argues is due in part to capital outflows from Austria after the 1873 Vienna stock market crash (Komlos, 1983). It is possible that the changes in land-use that we observe in the immediate period after the customs union were the predecessors to the subsequent changes in per capita production growth rates. Moreover, if it were true that the customs union had no effect on Hungarian agriculture and that trends were in place as early as 1828, then we should not observe any evidence of adjustments to factors of production − in our case, land − as a result of the customs union. The changes in land-use that we observe in Table 4, however, are consistent with increased specialization in agriculture in Hungary after 1850. In the next section, we run a series of robustness checks to establish the validity of our main results.

Robustness checks

Our main results are generally robust to including an interaction term between the post-union dummy and a quadratic of distance to the discontinuity, a test that allows the slope of the distance variable to change on either side of the discontinuity, and is in line with the recommendations of Guido W. Imbens and Thomas Lemieux (2008) and David Lee and Thomas Lemieux (2009). We also check to see if our results are robust to narrower definitions of the discontinuity (30 kilometers and 20 kilometers). We observe impacts of slightly larger magnitude, with similar levels of significance to the 40-kilometer sample. These estimations are shown in the online Appendix in Tables B3 and Table B4. We also include district by year trends. Our results remain

similar with these time trends included, but we suspect that they introduce significant collinearity into the specification, given that they exploit very similar district-level variation to our treatment effect (See tables in online Appendix C). Consistent with this observation, the magnitude of the point estimates with district by year trends is quite large.

While we hope that our strategy is not threatened by omitted variables, in the absence of a pure randomized experiment, there always remains the possibility that the inclusion of key omitted variables in the estimation might overturn the result. To assess this possibility, we follow the recommendations of Emily Oster (2017), who proposes a test based on the premise that changes in the coefficients of interest with the introduction of covariates can be informative about possible changes in estimation of treatment effects with the inclusion of omitted variables. The crux of the test is a conjecture about the covariance between the omitted variable and the treatment variable. One commonly made assumption is that the covariance between the omitted and treatment variable is equivalent to that between the observables and the treatment variable. This is known as the proportional selection assumption and implies a coefficient of proportionality (δ) equal to 1. We calculate the coefficient of proportionality that would overturn our results.[22] This coefficient is shown in the bottom row of Tables 4 and B2. For cropland, the coefficient of proportionality required to overturn the post-union x time trend result is over 8 for the parsimonious specification, and almost 10 for the full set of covariates. This indicates that an omitted variable would have to be substantially more correlated with the treatment variable than is the current set of observables in order to render the treatment effect equal to zero. The results for forest are similarly stable.

We also check to see whether it makes a difference to exclude districts that do not have meaningful variation in mapping dates, in other words, those that fall within the 40-kilometer border, but only have observations mapped either before or after the customs union. Table B2 contains estimates from the 10 districts that have before and after 1850 maps within them. This is a relatively smaller sample, but the results remain robust with both clustered and wild-bootstrap clus-

[22]Based on Oster's (2017) recommendation, we assume an Rmax equal to 1.3 times the R-squared achieved by the full regression specification for each outcome. The Rmax is an estimate of the R-squared that would be achieved in the case where we were able to include all the key unobservables.

tering, and the estimated δ's are again quite large.

Additionally, we limit the Hungarian data to points mapped from 1840 to 1849, and move the discontinuity to 1844 to see if there are effects of the trade union where there should not be any. These results are shown in Table 5. There are no significant impacts of the placebo discontinuities, which is heartening, although we lose a considerable number of observations by removing the post-1850 data. Nonetheless, the data show no "anticipatory" effects – that is, land-use did not change significantly in advance of the policy change. Another interpretation of this test is that – at least prior to 1850 – mapping did not result in detectable changes in landholder production choices. The estimate on pasture is marginally significant but not robust.

TABLE 5 HERE.

We are also concerned that the results could be driven by population changes. As mentioned in the data description, the population data are available only at the district level and are limited. We have data for the years 1840, 1846, 1851, and 1857. Generally speaking, the data show population declining prior to 1850 and slightly increasing afterwards in the districts that we analyze. This could potentially explain the increase in agricultural production. However, in addition to being rather sparse, the quality of the population data prior to 1850 is suspect, given that Hungarians had a strong incentive to underreport population during the era leading up to the failed revolution of 1848.[23] Nonetheless, when we include district population density in the year nearest to the map year, the agriculture results hold up in all samples, though the result on natural vegetation becomes weaker (see online Appendix D).

Heterogeneity by distance to border

Finally, we test to see whether or not logical correlations exist between distance to the Hungarian border, land-use, and the discontinuity. If it is the case that trade is the force driving the observed land-use change, we would expect it to be sensitive to travel costs. Most travel at this

[23]Katharine Dux (1968) reports that population data for Hungary in the period between 1830 and 1846 has been shown to be unreliable. Village mayors often believed that an increase in taxes would result from census reporting and therefore tried to conceal true population figures (Dux, 1968).

time was done by horse and carriage, or approximately 25 kilometers per day. Some trade took place on the Danube, but due to the mountainous, forested terrain throughout much of the empire, river and canal navigation did not attain the same significance as it did in other parts of Europe (Good, 1984).[24] To test the importance of travel costs, we interact the post-union and post-union time trend variables with a measure of proximity to the border between Austria and Hungary (specifically, 1/km to the border).[25] Table 6 shows the estimates from just the impact and interaction terms, and online Figure E7 illustrates the total marginal effects and 95% confidence intervals calculated for distances up to 80 kilometers to the border (they remain flat thereafter). We observe that the significant increases in agriculture, and decreases in forest, are concentrated with less than 50 kilometers of the border.

TABLE 6 HERE.

Alternative mechanisms

Emancipation of the serfs

The years around 1850 were marked by a number of liberal reforms, in addition to the customs union. One such reform was the formal emancipation of serfs in 1848. If the freeing of the serfs was accompanied by an increase in agricultural labor productivity, this could potentially confound the results presented here. While our data limits us from formally testing this hypothesis, we believe that the emancipation is not likely driving the observed land-use changes and specialization patterns for the following reasons.

First, our findings indicate that agricultural land area increased in Hungary and decreased in Moravia in the post-customs union era, suggesting that trade openness induced a pattern of

[24]Intensive road building began in the late 18th century and by 1847 Austria alone had developed a primary road network over 96,000 kilometers in length (Good, 1984). Railroad construction began in 1835, but did not take-off until the early 1870s as the predominant method of transportation.

[25]To clarify the variation used in this estimation, online appendix figure E4 shows the subsample of points used in estimation here, including the 1850 discontinuity line, as well as shading coding the distance to the Hungarian border with Austria.

specialization consistent with Hungarian comparative advantage in agriculture and Moravian advantage in non-agricultural production. If the 1848 emancipation were driving our results, then the effects of free labor would have to be different between Austria and Hungary. That is, the newly-freed serfs in Hungary were either inherently more productive than Austrian serfs, or free labor migrating from Austria to Hungary after the emancipation skewed the relative labor endowment in favor of Hungary, resulting in comparative advantage in agriculture. It is unlikely that widespread internal migration occurred between Austrian and Hungarian regions, given ethnic and linguistic barriers between the two regions. While official migration statistics for Hungary are scarce, internal migration within the Monarchy appears to have been between Austrian regions (Good, 1984). There is also little reason to believe that Hungarian agricultural labor was more efficient. If anything, in the years immediately following the reforms, there was better access to mechanized inputs in Austria (Komlos, 1983).

The historical literature also supports the notion that the serf emancipation had little effect on economic outcomes. First, serf labor represented only a small proportion of total agricultural labor in either region. In Hungary, *robot* (the system of forced labor used throughout the Habsburg Monarchy) days worked by the peasantry were 4.4% of total agricultural labor supply, while in Austria it constituted approximately 9% of total agricultural labor (Good, 1984). Komlos (1983) provides considerable evidence that the economic effects of the emancipation of the serfs were quite small. He assumes that free labor was 50% more productive than serf labor and estimates that the effect of the 1848 reform was minimal: 1.2% increase in GNP in Hungary and a 2.4% increase in Austria (Komlos, 1983). Unfortunately, our own production data, which comes from the imperial statistical records, does not have observations for 1848. Due to the turmoil of the revolutions and reforms of 1848-1850, official production data is missing from 1847-1850. Therefore, it is not possible empirically to test for a discontinuity in agricultural productivity around 1848.

Technological change

The 18th and 19th centuries were a time of major technological development in Europe, so it is possible that changes in agricultural technology drive our primary results. For this to be a con-

founding factor, technology would need to have increased differentially across our discontinuities of interest shown in Figure 3. We believe that this is unlikely for several reasons. First, while it is possible that different areas around the discontinuity could have been using different technologies prior to the customs union (for instance, extensive technologies on one side and intensive on the other), this seems improbable given that we document no significant differences in geophysical characteristics, such as soil quality, ruggedness, and distance to markets, around the discontinuity. That is, intensive vs. extensive agricultural practices are determined by the underlying characteristics of land values, for which we do not observe any differences in our discontinuity sample.

Second, while differential growth rates of capital-driven agricultural productivity between Austria and Hungary have been documented in the literature, these differences are identified at least 20 years after 1850 and are typically attributed to outflows of Austrian capital following the Great Depression of 1873-95 in Austria (Komlos, 1983; Schulze, 2000, 2007). As of 1870, Austria and Hungary displayed similar value-added per worker in the agricultural sector − 349 Kronen in Austria and 338 Kronen in Hungary. It was not until 1870 to 1910 that labor productivity growth rates diverged to 1.69% per annum growth in value-added per worker in agriculture in Hungary and 1.12% per annum in Austria (Schulze, 2007).[26]

Lastly, there is some evidence that adoption of new technologies, such as fertilizers, threshers and food processing machinery lagged well behind in the Habsburg Monarchy compared to the rest of Europe. By 1910, chemical fertilizer consumption in Austria-Hungary was 3 kg per hectare and 0.6% of gross production, compared to 29 kg and 3.6% respectively in Germany, and 7 kg and 1.7% respectively throughout Europe (van Zanden, 1991). Moreover, although Komlos (1983) discusses increases in mechanical and steam threshers in Hungary between the 1840s and

[26]Work by Jan Luiten van Zanden (1991) estimates agricultural productivity for both Austria and Hungary around 0.75 units of production per capita and 0.50 units of production per hectare in 1870, with productivity increasing by 1.11% per annum in Hungary and 1.21% per annum in Austria between 1870 and 1910. These estimates are based on a Cobb-Douglas production function in which land, labor, and livestock are weighted as 0.35, 0.5, and 0.15 (van Zanden, 1991). The Schulze (2007) figures in the text are based on constant price output and account for physical and human capital, as well as labor force composition.

1860s, he argues that this improved mechanization accounted for only 4% of the threshing requirement of Hungary and was consequently too small a scale to affect production over the same time period (Komlos, 1983). We therefore conclude that there is insufficient evidence of differential technological change around our sample area to confound our original estimates.

Implications and conclusions

Our paper tries to identify the impact of a reduction in barriers to trade on the distribution of production and land-use. Using a modified spatial discontinuity approach with disaggregated data from historical maps, we show that the 1850 customs union between Austria and Hungary resulted in a significant reallocation of production. Austria reduced its agricultural land-use, while Hungary increased the amount cropland at the expense of forest. We rule out that the adjustment in agricultural land in Hungary was part of a trend that began prior to the customs union, that it was a result of the emancipation of the serfs which occurred around the same time, or that it stemmed from differential adoption of agricultural technology. We also show that the estimates are sensitive to distance from the border between the two regions, thus more precisely identifying the trade mechanism.

We interpret these results as specialization induced by the lowering of tariffs. The benefits of this specialization, however, may have been uneven. While we do observe some decrease in agricultural land in Austria immediately after the customs union, recent literature suggests that Austria did not fully specialize in manufacturing. Schulze (2007) shows using aggregated census data that Austrian aggregate productivity growth was stifled by a slow exit of workers from the agricultural sector and low rates of capital formation between 1870 and 1910. Moreover, while capital intensity increased rapidly in Austria between 1890 and 1910, it did not translate into labor productivity growth in the manufacturing sector. By 1910, Austria's per capita GDP was just 53% of Germany's, while Hungary's stood at 40% (Schulze, 2007).

Our findings for Hungary support the historiography that documents a dominance of the agricultural sector in Hungary throughout the 19th and early 20th centuries (Komlos, 1983; Good, 1984; Schulze, 2000, 2007). Our results are also in line with observations of interdepen-

dence in trade between Austria and Hungary during the last 40 years of the Monarchy's reign in which Hungary maintained a trade surplus in agricultural goods with Austria, while Austria maintained a trade surplus in manufacturing goods with Hungary (Eddie, 1989). The present paper contributes to the historical discussion by providing causal evidence that this specialization was catalyzed by the customs union.

In the long-run, there could be broader economic implications resulting from specialization, particularly in agriculture. When compared to manufacturing, there is evidence that the returns to education for agricultural workers are lower (Goetz and Rupasingha, 2004; Jolliffe, 2004). Therefore, in the event that one region specializes in agriculture, long-run investment may be stifled, resulting in negative long-run economic outcomes. Recent work shows that per capita GDP grew substantially faster in Hungary than Austria from 1870 to 1913, and that growth in value-added per worker across agriculture, manufacturing, finance, and transport were much higher in Hungary over this period, as well (Schulze, 2000, 2007).[27] However, there is some suggestive evidence that this growth was not coincident with long run investment. It may be the case that Hungary's specialization in agriculture created disincentives to invest in human capital and other economic fundamentals. Figure 5 shows that the average years of schooling was consistently lower in Hungary than in Austria and increased at a slower rate over the latter 19th and early 20th centuries. In addition, while per capita GDP grew at a higher rate in Hungary than in Austria, per capita income levels remained higher in Austria than Hungary over this period. Lastly, per capita savings – an important determinant of macro-level investment and economic growth – started out at similar levels for Austria and Hungary in 1870, but quickly diverged over the next 40 years, with Austria's savings becoming increasingly greater than Hungary's.

FIGURE 5 HERE.

In addition to contributing to the historical debate, our findings add to the broader discussion of the relationship between globalization and the environment. In the context we exam-

[27]Schulze (2007) argues that capital outflows from Austria to Hungary after the Vienna stock market crash of 1873 are likely responsible for the decline in Austrian per capita GDP growth and increase in Hungarian income growth from 1870-1890. This pattern reversed, however, after financial recovery in Austria post-1890, after which point the Austrian economy grew at a faster pace than Hungary.

ine, forest was sacrificed in favor of agriculture. Because of this, our work also contributes to the ongoing discussion regarding the impacts of trade liberalization on natural resource use (see Brian R Copeland and M Scott Taylor (2004) for a review). While there are a significant number of theoretical papers on this issue,[28] the majority of the empirical work relies on cross-country estimations where endogeneity concerns are very difficult to address and results are contradictory.[29] A few papers use within-country estimates where it is difficult to separate out general time trends (Barbier, 2000; Faria and de Almeida, 2013). Our approach is unique in its ability to focus on the impacts of trade openness on various types of land-use, including forest, pasture, and agriculture. However, we are unable to measure the net effect of this activity – that is, the amount of forest which grew back in Austria as it was cut down in Hungary. This is both because we do not have data for the entire Austrian region of the Monarchy, but also because our identification strategy relies on a local treatment effect. The true externality effects of this reallocation of activity could only be assessed were we able to examine the value of the regrown forest relative to that of the forest lost to agriculture.

Using highly disaggregated data and a clean identification strategy, we are able to make sound claims about the effect of trade liberalization on land-use. We find evidence of specialization with

[28]See Kiminori Matsuyama (1992), Graciela Chichilnisky (1994), and James Brander and M. Scott Taylor (1997).

[29]Susana Ferreira (2004) finds over a cross-section of countries from 1990-2000 that trade openness increases deforestation in places where bureaucratic quality is poor and government enforcement of contracts is weak. Ramón López and Gregmar I. Galinato (2005) focus specifically on Brazil, Indonesia, Malaysia, and the Philippines from 1980 to 1999, and show that trade has no significant effect on forest cover in Indonesia and Malaysia, but increases forest cover in Brazil and the Philippines through a reduction in agricultural expansion. Tsurumi Tetsuya and Managi Shunsuke (2012) examine a cross-section of countries from 1990 to 2003 using a dynamic model that treats trade and income as endogenous, and find that trade increases deforestation in non-OECD countries and decreases the rate of deforestation in OECD countries. Rafael Gonzalez-Val and Fernando Pueyo (2013) develop a general equilibrium model to explain the short and long-run effects of trade openness on deforestation, based on the role of trade liberalization in determining relative prices, migration, transport costs, and industrial concentration. The model predicts that in the short run, reductions in transport costs increase deforestation, but that in the long run the effects reverse.

the elimination of trade barriers that resulted in forest loss in Hungary, which had a comparative advantage for agriculture. The impact of these tradeoffs in the long term remains an interesting area of inquiry for future work.

References

Austria, Statistisches Central-Comission. *Tafeln zur Statistik der Österreichischen Monarchie*. Vienna: Kaiserliche-Königliche Hof- und Staats-Druückerei, 1828-1865.

———. *Statistisches Jahrbuch der Österreichischen*. Vienna, 1862-1881.

———. *Östrreichisches statistisches Handbuch fur die im Reichsrathe vertretenen Konigreiche und Lander*. Vienna, 1882-1914.

Balassa, Bela. "An empirical demonstration of classical comparative cost theory." *Review of Economics and Statistics* 45, no. 3 (1963): 231–238.

Barbier, Edward B. "Links between economic liberalization and rural resource degradation in the developing regions." *Agricultural Economics* 23, no. 3 (2000): 299–310.

Basten, Cristoph and Frank Betz. "Beyond work ethic: religion, individual, and political preferences." *American Economic Journal: Economic Policy* 5, no. 3 (2013): 67–91.

Becker, Sascha O., Katrin Boeckh, Christa Hainz, and Ludger Woessmann. "The empire is dead, long live the empire! Long-run persistence of trust and corruption in the bureaucracy." *The Economic Journal* 126, issue 590 (2016): 40–74.

Bernhofen, Daniel M and John C. Brown. "A direct test of the theory of comparative advantage: the case of Japan." *Journal of Political Economy* 112, no. 1 (2004): 48–67.

Brander, James and M. Scott Taylor. "International trade and open-access renewable resources: The small open economy case." *The Canadian Journal of Economics* 30, no. 3 (1997): 526–552.

Cameron, A. Colin, Jonah B. Gelbach, and Douglas L. Miller. "Bootstrap-based improvements for inference with clustered errors." *The Review of Economics and Statistics* 90, no. 3 (2008): 414–427.

Chichilnisky, Graciela. "North-South trade and the global environment." *The American Economic Review* 84, no. 4 (1994): 851–874.

Copeland, Brian R and M Scott Taylor. "Trade, Growth, and the Environment." *Journal of Economic Literature* 42, no. 1 (2004): 7–71.

Costinot, Arnaud. "An elementary theory of comparative advantage." *Econometrica* 77, no. 4 (2009): 1165–1192.

— and Andres Rodriguez-Clare. "Trade Theory with Numbers: Quantifying the Consequences of Globalization." In *The Handbook of International Economics,* Vol. 4, edited by Elhanan Helpman, Kenneth Rogoff, and Gita Gopinath, chapter 4. Amsterdam: Elsevier, 2014.

— and Dave Donaldson. "How large are the gains from economic integration? Theory and evidence from U.S. agriculture, 1880-1997." NBER Working Paper No. 22946, 2016.

—, —, and Ivana Komunjer. "What goods do countries trade? A quantitative exploration of Ricardo's ideas." *Review of Economic Studies* 79, no. 2 (2012): 581–608.

Dell, Melissa. "The persistent effects of Peru's mining mita." *Econometrica* 78, no. 6 (2010): 1863– 1903.

Dux, Katharine. "Estimating the number of the population by superposing trend functions." Colloquium on historical demography Budapest, 1965-1968.

Eaton, Jonathan and Samuel Kortum. "Technology, geography, and trade." *Econometrica* 70, no. 5 (2002): 1741–1779.

Eddie, Scott. "The changing pattern of landownership in Hungary, 1867-1914." *The Economic History Review* 20, no. 2 (1967): 293–310.

—. "The terms of trade as a tax on agriculture: Hungary's trade with Austria, 1883-1913." *The Journal of Economic History* 32, no. 1 (1972): 298–315.

—. "The terms of trade and pattern of Hungarian foreign trade, 1882-1913." *The Journal of Economic History* 37, no. 2 (1977): 329–358.

—. "Economic Policy and Economic Development in Austria-Hungary, 1867-1913." In *The Cambridge*

Economic History of Europe from the Decline of the Roman Empire Volume 8: The Industrial Economies: The Development of Economic and Social. edited by Peter Mathias and Sidney Pollard, 814-886. Cambridge: Cambridge University Press, 1989.

Egger, Peter H. and Andrea Lassmann. "The causal impact of common native language on inter- national trade: evidence from a spatial regression discontinuity design." *The Economic Journal* 125, issue 584 (2015): 699–745.

ESDB. "The European Soil Database distribution version 2.0." European Commission and the European Soil Bureau Network, CD-ROM, EUR 19945 EN 2004.

Faria, Weslem Rodrigues and Alexandre Nunes de Almeida. "Relationship between Openness to Trade and Deforestation: Empirical Evidence from the Brazilian Amazon." Working paper, The University of Sao Paulo, Regional and Urban Economics Lab, 2013.

Ferreira, Susana. "Deforestation, property rights, and international trade." *Land Economics* 80, no. 2 (2004): 174–193.

Goetz, Stephan J and Anil Rupasingha. "The returns to education in rural areas." *The Review of Regional Studies* 34, no. 3 (2004): 245–259.

Golub, Stephen S. and Chang-Tai Hsieh. "Classical Ricardian theory of comparative advantage revisited." *Review of International Economics* 8, no. 2 (2000): 221–234.

Gonzalez-Val, Rafael and Fernando Pueyo. "Trade liberalization and global-scale forest transition." Fondazione Eni Enrico Mattei Working Paper, 2013.

Good, David F.. "The great depression and Austrian economic growth after 1873." *Economic History Review* 31, no. 2 (1978): 290–294.

—. *The Economic Rise of the Habsburg Empire: 1750-1914*. Berkeley, Los Angeles, London: University of California Press, 1984.

— and Tongshu Ma. "New estimates of income levels in central and eastern Europe, 1870-1910." In *Von der Theorie zur Wirtschaftspolitik – ein österreichischer Weg: Festschrift zum 65. Geburtstag von Erich W. Streissler*, edited by F. Baltzarek, F. Butschek, and G. Tichy, 147-168. Stuttgart: Lucius & Lucius, 1998.

Grosfeld, Irena and Ekaterina Zhuravskaya. "Cultural vs. economic legacies of empires: evidence from the partition of Poland," *Journal of Comparative Economics* 43, no. 1 (2015): 55–75.

Grosjean, Pauline and Claudia Senik, "Democracy, market liberalization, and political preferences." *The Review of Economics and Statistics* 93, no. 1 (2011): 365–381.

Imbens, Guido W. and Thomas Lemieux. "Regression discontinuity designs: A guide to practice." *Journal of Econometrics* 142, no. 2 (2008): 615–635.

Jolliffe, Dean. "The impact of education in rural Ghana: examining household labor allocation and returns on and off the farm." *Journal of Development Economics* 73, no. 1 (2004): 287–314.

Kausel, Anton. "Österreichs Volkseinkommen 1830-1913," in "Geschichte und Ergebnisse der zentralen amtlichen Statistik in Österreich 1829-1979." Vienna: Österreichisches Statistisches Zentralamt, 1979.

Kir, Statistikai Hivátalos Országos Magyar. *Magyár Statistikai Közlemények*. Budapest: Kon. Ung. Statistische Bureau, 1871-1911.

— . *Magyár Statistikai Évkönyv*. Budapest: Kon. Ung. Statistische Bureau, 1893-1918.

Komlos, John. *The Habsburg Monarchy as a Customs Unions: Economic Development in Austria- Hungary in the Nineteenth Century*. Princeton: Princeton University Press, 1983.

Konkoly-Gyuró, Eva. "A tájhasználat és a népesség alakulása a Zempléni-hegység térségében [Land use and population change in the Zemplén mountains region]." *Gazdálkodás [Land Management]*, 1991.

— , "A táj mező-és erdőgazdasági hasznosítása a Zempléni hegységben [Agricultural and sylvicultural land

use in the Zemplén regions from the settlement to the middle of the 19th century].” *Historia Forestalis* 20 (1995): 5–53.

— . “Tájkaraktert formáló történeti tájváltás és jelenkori konfliktusok a Fertő-Hanság vidékén.” in S. Frisnyák, ed., *A Dunántúl és a Kisalföld történeti földrajza*, Nyíregyháza-Pécs, 2003, pp. 95–109.

Kozak, Jacek. “Forest cover change in the West Carpathians in the past 180 years - a case study in the Orawa Region in Poland.” *Mountain Research and Development* 23, no. 4 (2003): 369–375.

Lee, David and Thomas Lemieux. “Regression discontinuity designs in economics.” NBER Working Paper Series No. 14723.” 2009.

López, Ramón and Gregmar I. Galinato. “Trade policies, economic growth, and the direct causes of deforestation.” *Land Economics* 81, no. 2 (2005): 145–169.

MacDougall, G. Donald. “British and American exports: a study suggested by the theory of comparative costs, part I.” *The Economic Journal* 61, no. 244 (1951): 691–724.

Matsuyama, Kiminori. “Agricultural productivity, comparative advantage, and economic growth.” *Journal of Economic Theory* 58, no. 2 (1992): 317–334.

Michalopoulos, Stelios and Elias Papaioannou. “National institutions and subnational development in Africa.” *Quarterly Journal of Economics* 129, no. 1 (2014): 151–213.

Munteanu, Catalina, Tobias Kuemmerle, Martin Bolitziar, et al.. “Forest and agricultural land change in the Carpathian region - A meta-analysis of long-term patterns and drivers of change.” *Land Use Policy* 38 (2014): 685–697.

— , — , Nicholas S. Keuler, et al. “Legacies of 19th century land use shape contemporary forest cover.” *Global Environmental Change* 34 (2015): 83–94.

Nagy, Dezsö. *A Gömör-Tornai Karszt történeti felszínborítása*. ANP füzetek V. Jósvafő, 2008.

— . “A történeti felszínborítás és tájhasználat a Bodrogközben.” in Z. Tuba, ed., *Bodrogköz - A*

magyarországi Bodrogköz tájmonográfiája GödöllHö, Sárospatak, 2008.

—. "A történeti felszínborítás térképezése a Tisza-völgyben [Historical land cover mapping in the Tisza valley]." In *A történeti felszínborítás térképezése a Tisza-völgyben,* edited by Zsuzsanna Flachner, Andras Kovacs, and Éva Kelemen. Budapest: SZVÖET, 2008.

Nunn, Nathan and Diego Puga. "Ruggedness: The Blessing of Bad Geography in Africa." *Review of Economics and Statistics* 94, no. 1 (2012): 20–36.

Ostafin, Krzysztof. *Zmiany granicy rolno-leśnej w środkowej części Beskidu Średniego od polowy XIX wieku do 2005 roku*. Kraków: Wydawnictwo UJ, 2009.

Oster, Emily. "Unobservable selection and coefficient stability: Theory and evidence." *Journal of Business & Economic Statistics* (2017): 1-18.

Sandgruber, Roman. "Osterreichische Agrarstatistik, 1750-1918." Wien 1978.

Schulze, Max-Stephan. "Patterns of growth and stagnation in the late nineteenth century Habsburg economy." *European Review of Economic History* 4, no. 3 (2000): 311–340.

—. "Origins of catch-up failure: Comparative productivity growth in the Habsburg Empire, 1870- 1910." *European Review of Economic History* 11, no. 3 (2007): 189–218.

Schumann, Abel. "The persistence of population shocks: evidence from the occupation of West Germany after World War II." *American Economic Journal: Applied Economics* 6, no. 3 (2014): 189–205.

Shandra, Alya, Peter Weisberg and Vazira Martazinova. "Influences of climate and land use history on forest and timberline dynamics in the Carpathian mountains during the twentieth century." In *The Carpathians: Integrating nature and Society Towards Sustainability*, edited by Jacek Kozak, Katarzyna Ostapowicz, Andrezej Bytnerowicz, and Bartlomiej Wyzga, 209-223. Berlin: Springer, 2013.

Stern, Robert M.. "British and American productivity and comparative costs in international trade." *Oxford Economic Papers* 14, no. 3 (1962): 275–296.

Tetsuya, Tsurumi and Managi Shunsuke. "The effect of trade openness on deforestation: empirical analysis for 142 countries." *Environmental Economics and Policy Studies* 16, no. 4 (2012): 1–20.

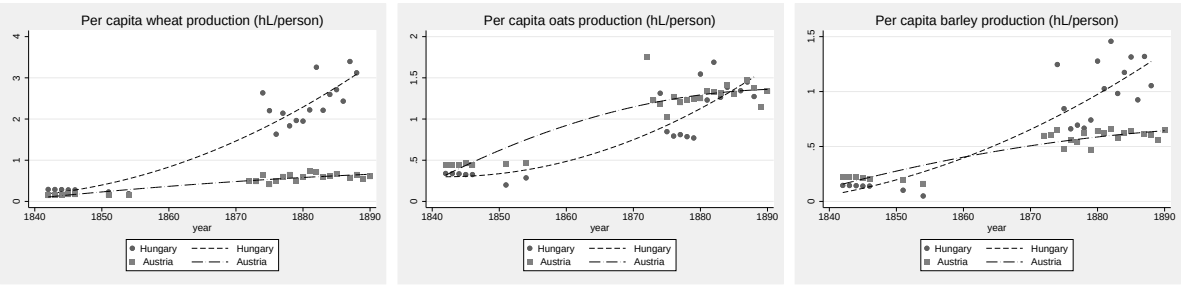
Timár, Gábor, Gábor Molnár, Balázs Székeley, et al.. "The Map Sheets of the Second Military Survey and their Georeferenced Version." 2006. Budapest: Arcanum Project.

van Zanden, Jan Luiten. "The First Green Revolution: The Growth of Production and Productivity in European Agriculture, 1870-1914." *The Economic History Review* 44, no. 2 (1991): 215–239.

Veres, Madalina Valeria. "Constructing imperial spaces: Habsburg cartography in the Age of Enlightenment." PhD dissertation, University of Pittsburgh 2015.

Figures

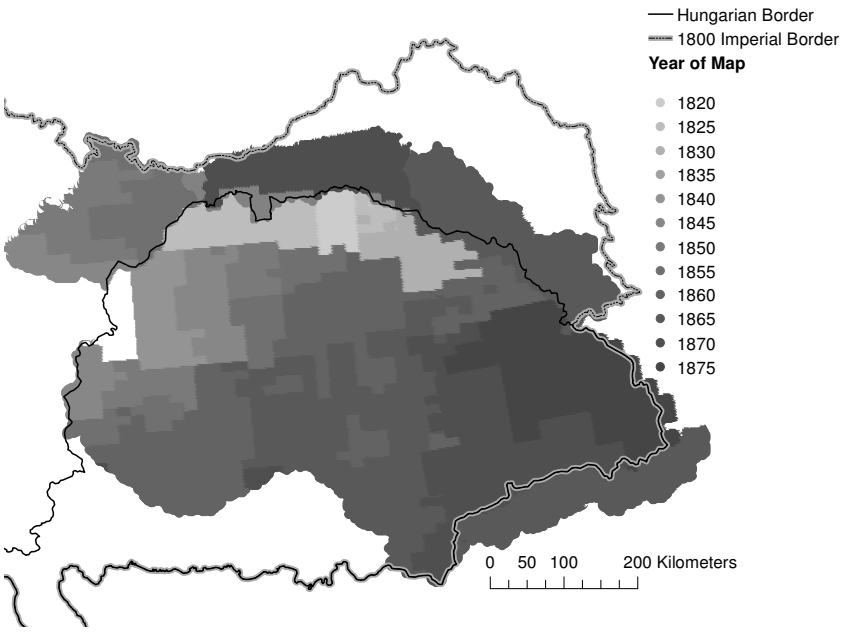
Figure 1: Austro-Hungarian Agricultural Production Specialization



(a) Wheat (b) Oats (c) Barley

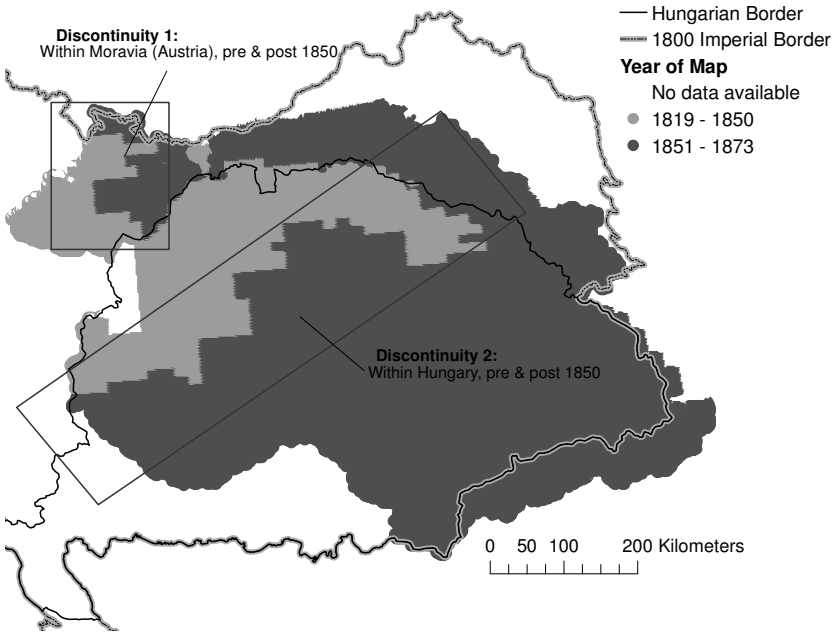
Dots indicate averages of observations within Austria and Hungary by year, and lines are fitted second order polynomials. Sources: *Tafeln zur Statistik der Österreichischen Monarchie* (Austria, Statistisches Central-Comission, 1865), *Statistisches Jahrbuch der Oesterreichisch-Ungarischen Monarchie* (Austria, Statistisches Central-Comission, 1881), *Östrreichisches statistisches Handbuch fur die im Reichsrathe vertretenen Konigreiche und Lander* (Austria, Statistisches Central-Comission, 1914), *Magyár Statistikai Közlemények* (Országos Magyar Kir, 1911), and *Magyár Statistikai Évkönyv* (Országos Magyar Kir, 1918).

Figure 2: Year in which the 2nd Military Survey was conducted



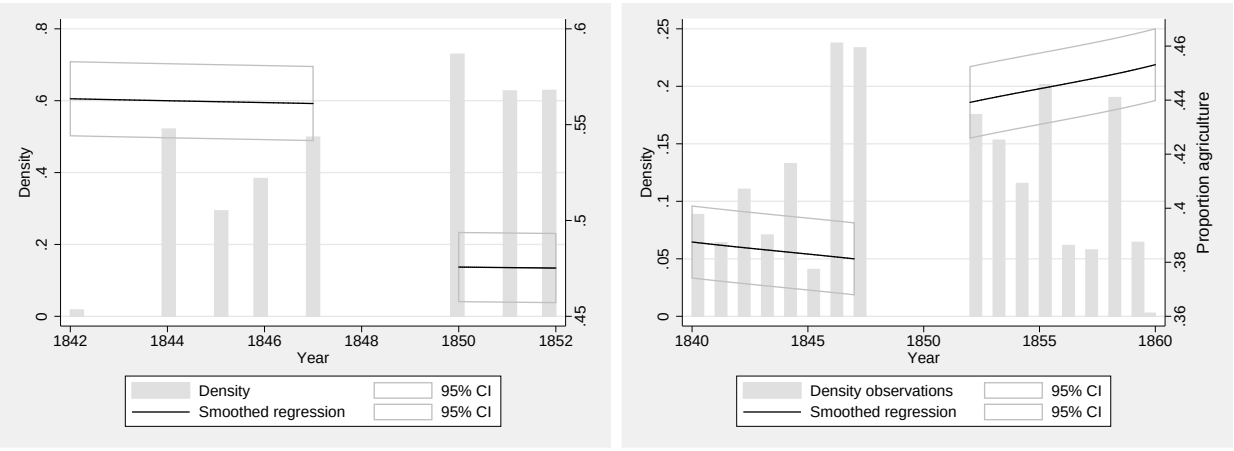
Shading indicates approximate mapping year for each military map in the study sample. Source: authors' calculations using Timár et al. (2006) historical maps.

Figure 3: Spatial-temporal discontinuities



Dark grey indicates areas mapped after 1850 and light grey before. The black boxes highlight the approximate regions of of interest for data analysis. Source: authors' calculations using Timár et al. (2006) historical maps.

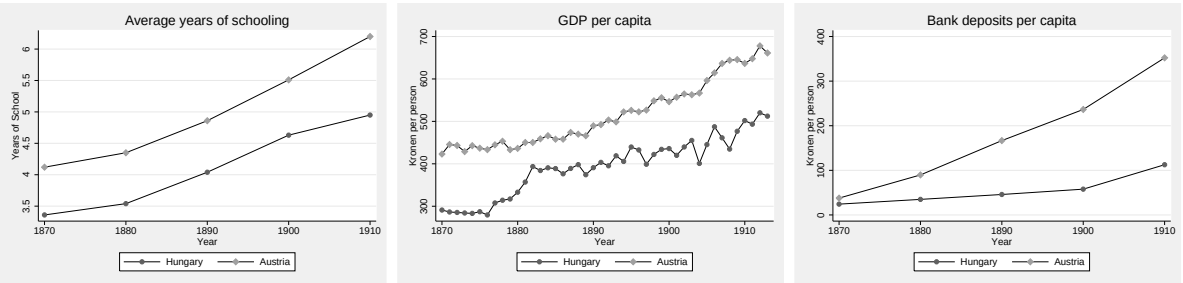
Figure 4: Discontinuities for crops



(a) Austria (b) Hungary

The figures show kernel-smoothed regressions before and after 1850, where dependent variable is an indicator for if the point was used in agriculture in a given year. The densities show the distribution of the data across years, thus indicating the proportion of observations used in the regression in each year bin. Source: authors' calculations using Timár et al. (2006) historical maps.

Figure 5: Long Run Investment Outcomes



(a) Education (b) Per capita GDP (c) Savings

Sources: Schulze (2007) for figures (a) and (b). *Tafeln zur Statistik der Österreichischen Monarchie* provided by David Good for figure (c).

Tables

Table 1: Structure of Austro-Hungarian Trade

Panel A: Net exports (millions crowns)

Goods categories	Five-Year Average	Austria to Hungary	Austria to non-Hungary	Hungary to non-Austria	Monarchy Total
Field crops,	1884-1888	-196.6	158.6	59.0	217.7
sugar, and flour	1889-1893	-280.8	219.5	75.0	294.5
	1894-1898	-320.0	121.3	17.4	138.7
	1899-1903	-363.7	147.3	65.5	212.8
	1904-1908	-454.8	135.7	48.5	184.2
	1909-1913	-560.0	40.9	23.1	64.0
Fibres and,	1884-1888	296.3	-178.8	0.9	-177.9
Textiles	1889-1893	314.3	-195.7	-0.8	-196.5
	1894-1898	348.3	-209.1	-3.3	-212.4
	1899-1903	370.9	-248.6	-4.3	-252.9
	1904-1908	449.0	-321.3	-16.4	-337.7
	1909-1913	537.6	-389.0	-32.0	-421.0
Total exports	1884-1888	137.1	168.4	93.1	261.3
or imports	1889-1893	37.7	204.3	110.6	314.9
	1894-1898	59.9	76.8	34.4	111.1
	1899-1903	-20.2	157.8	127.7	285.6
	1904-1908	39.5	3.1	67.8	71.0
	1909-1913	82.1	-412.5	-62.5	-475.0

Panel B: Partner's shares in each other's trade (percent)

		Austrian share in value of		Hungarian share in value of	
Goods categories	Five-Year Average	Hungarian Exports	Hungarian Imports	Austrian Exports	Austrian Imports
Field crops,	1884-1888	70.1	50.9	14.2	67.0
sugar, and flour	1889-1893	74.6	56.2	12.5	74.5
	1894-1898	79.4	35.5	13.1	69.8
	1899-1903	76.2	39.4	11.2	71.6
	1904-1908	79.8	33.0	10.7	73.2
	1909-1913	80.0	28.5	13.0	66.7
Fibres and,	1884-1888	75.5	94.9	65.0	14.3
Textiles	1889-1893	78.0	95.4	64.0	13.0
	1894-1898	79.2	92.7	66.7	12.3
	1899-1903	73.5	94.4	62.4	10.4
	1904-1908	68.2	91.9	60.2	9.7
	1909-1913	67.1	89.3	58.7	9.6
Total exports	1884-1888	71.7	84.0	38.3	37.0
or imports	1889-1893	73.6	83.1	37.4	40.2
	1894-1898	75.2	78.9	38.7	38.4
	1899-1903	70.9	78.3	34.7	37.5
	1904-1908	72.4	76.5	36.6	35.9
	1909-1913	74.1	73.2	39.1	33.8

source: Eddie (1989)

Table 2: Sample within Hungary

	Full sample			Discontinuity sample		
	(1)	(2)	(3)	(4)	(5)	(6)
	Before	After	Norm diff	Before	After	Norm diff
Crops (0/1)	0.360	0.341	-0.028	0.384	0.444	0.087
Pasture (0/1)	0.187	0.199	0.022	0.202	0.197	-0.008
Wetlands (0/1)	0.009	0.017	0.053	0.005	0.006	0.005
Forest/grasslands (0/1)	0.424	0.322	-0.150	0.389	0.330	-0.086
Urban (0/1)	0.007	0.014	0.048	0.012	0.012	-0.002
Ruggedness index	0.949	0.761	-0.196	0.753	0.659	-0.119
Km to nearest city	16.145	20.263	0.287	16.202	17.069	0.074
Km to nearest river	59.941	38.355	-0.518	56.237	55.260	-0.023
No ag. limitations (0/1)	0.802	0.731	-0.117	0.873	0.910	0.084
Approx. population density	65.603	45.933	-0.263	56.773	47.031	-0.475
Observations	15202	48266	63468	5064	5292	10356

The full sample includes all points mapped within Hungary. The discontinuity sample is limited to points mapped between 1840 and 1860 within 40 kilometers of the 1850 map line.

Table 3: Test of covariate discontinuity

	Dependent variable		
	Ag soil	Ruggedness	Proximity city
	(1)	(2)	(3)
Post Customs Union	-0.060	-0.045	0.023
	(0.061)	(0.124)	(0.016)
Years since 1850 x post union	0.013	-0.013	0.007
	(0.015)	(0.021)	(0.004)
Other covariates	yes	yes	yes
District FE	yes	yes	yes
Observations	10356	10356	10356
R^2	0.130	0.106	0.032
N districts	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of the 1850 discontinuity. Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, proximity to river, a quadratic of km to discontinuity, years since 1850, and ln(km to border with Austria).

Table 4: Impacts of customs union in Hungary

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.033	0.029	-0.029	-0.047	-0.029	0.011
	(0.055)	(0.044)	(0.049)	(0.042)	(0.068)	(0.036)
	[-0.180, 0.203]	[-0.058, 0.117]	[-0.191, 0.069]	[-0.183, 0.030]	[-0.209, 0.281]	[-0.048, 0.143]
Years since 1850 x post union	0.035*	0.031**	0.005	-0.002	-0.040**	-0.022*
	(0.017)	(0.015)	(0.010)	(0.010)	(0.015)	(0.012)
	[0.006, 0.108]	[0.010, 0.061]	[-0.013, 0.030]	[-0.031, 0.008]	[-0.123, -0.020]	[-0.051, 0.016]
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	10356	10356	10356	10356	10356	10356
R^2	0.007	0.048	0.003	0.018	0.014	0.126
δ	8.275	9.778	6.289	-0.772	10.610	2.795
N districts	23.000	23.000	23.000	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river. 95% wild bootstrap clustered CIs in [].

Table 5: Placebo impact test

	Dependent variable		
	Crops	Pasture	Forest
	(1)	(2)	(3)
Post union = 1 after 1844	-0.069	0.034	-0.004
	(0.058)	(0.061)	(0.040)
	[-0.292, 0.132]	[-0.251, 0.261]	[-0.177, 0.274]
Years since 1844 x post placebo	0.010	0.065*	-0.044
	(0.033)	(0.036)	(0.031)
	[-0.054, 0.130]	[-0.025, 0.195]	[-0.184, -0.025]
Other covariates	yes	yes	yes
District FE	yes	yes	yes
Observations	5065	5065	5065
R^2	0.056	0.027	0.146
N districts	16.000	16.000	16.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, ln(km to border with Austria), proximity to river, proximity to city, a quadratic of km to the discontinuity, and years since 1844. 95% clustered bootstrapped CIs in [].

Table 6: Impact of customs union by distance to Austro-Hungarian border

	Dependent variable		
	Crops	Pasture	Forest
	(1)	(2)	(3)
Post Customs Union	-0.020	-0.083*	0.095**
	(0.047)	(0.042)	(0.040)
Post union x border proximity	4.306**	3.610***	-7.736***
	(1.857)	(0.727)	(2.560)
Years since 1850 x post union	0.042**	0.008	-0.043***
	(0.017)	(0.011)	(0.013)
Post union x year x border proximity	-1.161**	-1.066***	2.157***
	(0.553)	(0.194)	(0.739)
Other covariates	yes	yes	yes
District FE	yes	yes	yes
Observations	10356	10356	10356
R^2	0.049	0.018	0.129
N districts	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, a quadratic for distance to discontinuity, proximity to river, and years since 1850. Border proximity is measured as 1/km to border

Appendix A Additional summary tables

Table A1: Summary statistics of variables used in analysis

	mean	sd	min	max
Crops (0/1)	0.358	0.479	0.000	1.000
Pasture (0/1)	0.181	0.385	0.000	1.000
Wetlands (0/1)	0.012	0.110	0.000	1.000
Forest/grasslands (0/1)	0.354	0.478	0.000	1.000
Urban (0/1)	0.012	0.109	0.000	1.000
Ruggedness index	0.837	0.665	0.000	3.093
Km to nearest city	17.864	11.143	0.022	80.520
Km to nearest river	43.157	28.737	0.001	137.848
No ag. limitations (0/1)	0.678	0.467	0.000	1.000
Approx. population density	53.095	46.742	20.424	3978.750
Observations	81407			

Appendix B Alternative discontinuity window results

Table B2: Impacts of customs union within Hungary
40 kilometer discontinuity, only districts with time variation

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.028	0.050	-0.042	-0.054	-0.001	0.009
	(0.062)	(0.051)	(0.062)	(0.050)	(0.073)	(0.027)
	[-0.209, 0.158]	[-0.095, 0.139]	[-0.274, 0.121]	[-0.236, 0.075]	[-0.096, 0.294]	[-0.017, 0.162]
Years since 1850 x post union	0.046*	0.049**	-0.001	-0.007	-0.050**	-0.039***
	(0.022)	(0.017)	(0.013)	(0.012)	(0.019)	(0.011)
	[-0.006, 0.135]	[0.028, 0.078]	[-0.021, 0.040]	[-0.034, 0.016]	[-0.141, -0.025]	[-0.059, -0.019]
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	7618	7618	7618	7618	7618	7618
R^2	0.010	0.049	0.004	0.018	0.019	0.125
δ	9.146	49.346	-0.824	-2.618	12.550	6.332
N districts	10.000	10.000	10.000	10.000	10.000	10.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river. 95% wild bootstrap clustered CIs in [].

Table B3: Impacts of customs union within Hungary
30-kilometer discontinuity

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.031	0.051	-0.058	-0.061	0.013	0.016
	(0.058)	(0.043)	(0.049)	(0.045)	(0.070)	(0.039)
Years since 1850 x post union	0.041**	0.038**	-0.003	-0.008	-0.040**	-0.025*
	(0.020)	(0.016)	(0.011)	(0.012)	(0.018)	(0.014)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	8186	8186	8186	8186	8186	8186
R^2	0.009	0.054	0.002	0.013	0.013	0.122
N districts	23.000	23.000	23.000	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 30 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Table B4: Impacts of customs union within Hungary
20-kilometer discontinuity

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.031	0.057	-0.055	-0.072	0.010	0.014
	(0.067)	(0.046)	(0.033)	(0.041)	(0.068)	(0.038)
Years since 1850 x post union	0.042*	0.045**	-0.005	-0.014	-0.042*	-0.031*
	(0.023)	(0.017)	(0.011)	(0.013)	(0.022)	(0.015)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	5772	5772	5772	5772	5772	5772
R^2	0.011	0.053	0.002	0.016	0.014	0.122
N districts	18.000	18.000	18.000	18.000	18.000	18.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 20 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Appendix C Results including district time trends

Table C5: Impacts of customs union within Hungary
with district trends

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.033	0.004	-0.029	-0.067	-0.029	0.063
	(0.055)	(0.100)	(0.049)	(0.044)	(0.068)	(0.071)
Years since 1850 x post union	0.035*	0.053**	0.005	-0.018	-0.040**	-0.030*
	(0.017)	(0.020)	(0.010)	(0.014)	(0.015)	(0.016)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	10356	10356	10356	10356	10356	10356
R^2	0.007	0.054	0.003	0.024	0.014	0.132
N districts	23.000	23.000	23.000	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Table C6: Impacts of customs union within Hungary
with district trends and using sample with within-district variation in treatment

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.028	0.004	-0.042	-0.066	-0.001	0.059
	(0.062)	(0.101)	(0.062)	(0.043)	(0.073)	(0.073)
Years since 1850 x post union	0.046*	0.055**	-0.001	-0.018	-0.050**	-0.032*
	(0.022)	(0.020)	(0.013)	(0.014)	(0.019)	(0.017)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	7618	7618	7618	7618	7618	7618
R^2	0.010	0.052	0.004	0.023	0.019	0.127
N districts	10.000	10.000	10.000	10.000	10.000	10.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Appendix D Results including population density

Table D7: Impacts of customs union in Hungary, including population

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.050	0.036	-0.014	-0.037	-0.064	-0.005
	(0.059)	(0.049)	(0.049)	(0.044)	(0.064)	(0.037)
Years since 1850 x post union	0.030	0.029*	0.001	-0.005	-0.031*	-0.018
	(0.018)	(0.015)	(0.010)	(0.010)	(0.016)	(0.013)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	10356	10356	10356	10356	10356	10356
R^2	0.008	0.048	0.004	0.018	0.017	0.126
N districts	23.000	23.000	23.000	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include ln(population density), years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Table D8: Impacts of customs union within Hungary – 40 kilometer discontinuity, only districts with time variation, including population density

	Dependent variable					
	Crops		Pasture		Forest	
	(1)	(2)	(3)	(4)	(5)	(6)
Post Customs Union	0.047	0.059	-0.027	-0.045	-0.037	-0.008
	(0.067)	(0.058)	(0.063)	(0.053)	(0.068)	(0.030)
Years since 1850 x post union	0.042*	0.047**	-0.004	-0.008	-0.043*	-0.036**
	(0.022)	(0.017)	(0.012)	(0.012)	(0.019)	(0.013)
Other covariates	no	yes	no	yes	no	yes
District FE	yes	yes	yes	yes	yes	yes
Observations	7618	7618	7618	7618	7618	7618
R^2	0.010	0.049	0.005	0.018	0.022	0.126
N districts	10.000	10.000	10.000	10.000	10.000	10.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. All estimates include ln(population density), years since 1850, a quadratic of distance to discontinuity, and ln(km to border with Austria). Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, and proximity to river.

Table D9: Impact of customs union by distance to Austro-Hungarian border, with population density

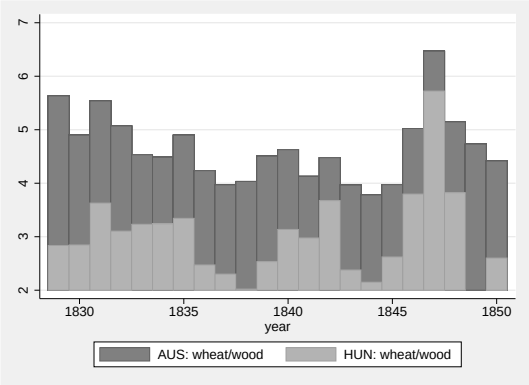
	Dependent variable		
	Crops	Pasture	Forest
	(1)	(2)	(3)
Post Customs Union	-0.014	-0.071	0.079*
	(0.053)	(0.044)	(0.041)
Post union x border proximity	4.200**	3.418***	-7.461**
	(1.957)	(0.659)	(2.687)
Years since 1850 x post union	0.041**	0.005	-0.039***
	(0.018)	(0.010)	(0.014)
Post union x year x border proximity	-1.137*	-1.022***	2.094**
	(0.579)	(0.173)	(0.780)
Other covariates	yes	yes	yes
District FE	yes	yes	yes
Observations	10356	10356	10356
R^2	0.049	0.019	0.129
N districts	23.000	23.000	23.000

* p< 0.10, ** p<0.05, *** p < 0.01.

Unit of observation is the point. Standard errors are in parentheses and are clustered at the district level. These are partial results using the sample within 40 km of a mapping border. Other covariates include ruggedness, an indicator for agricultural soil, proximity to city, a quadratic for distance to discontinuity, proximity to river, ln(population density), and years since 1850. Border proximity is measured as 1/km to border.

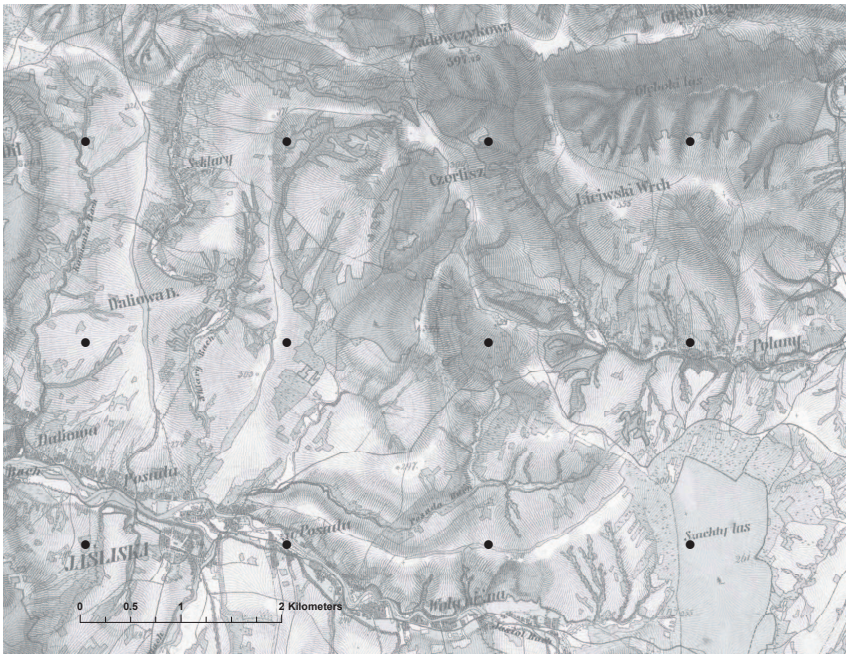
Appendix E Additional figures

Figure E1: Relative Prices



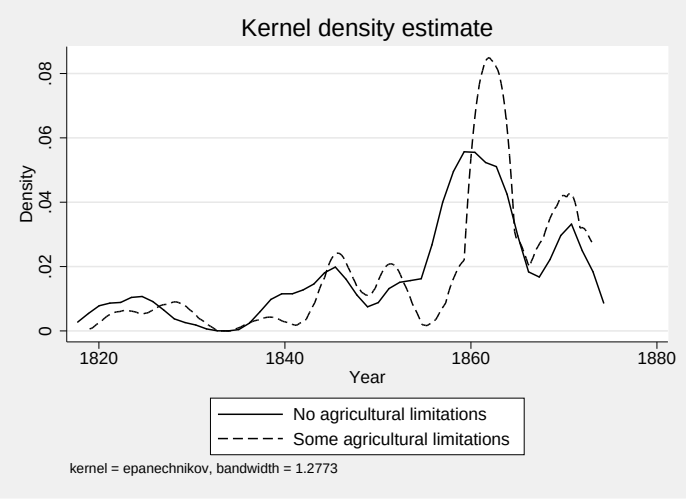
Source: *Tafeln zur Statistik der Österreichischen Monarchie* (1828-1865)

Figure E2: Historic map and sampled points



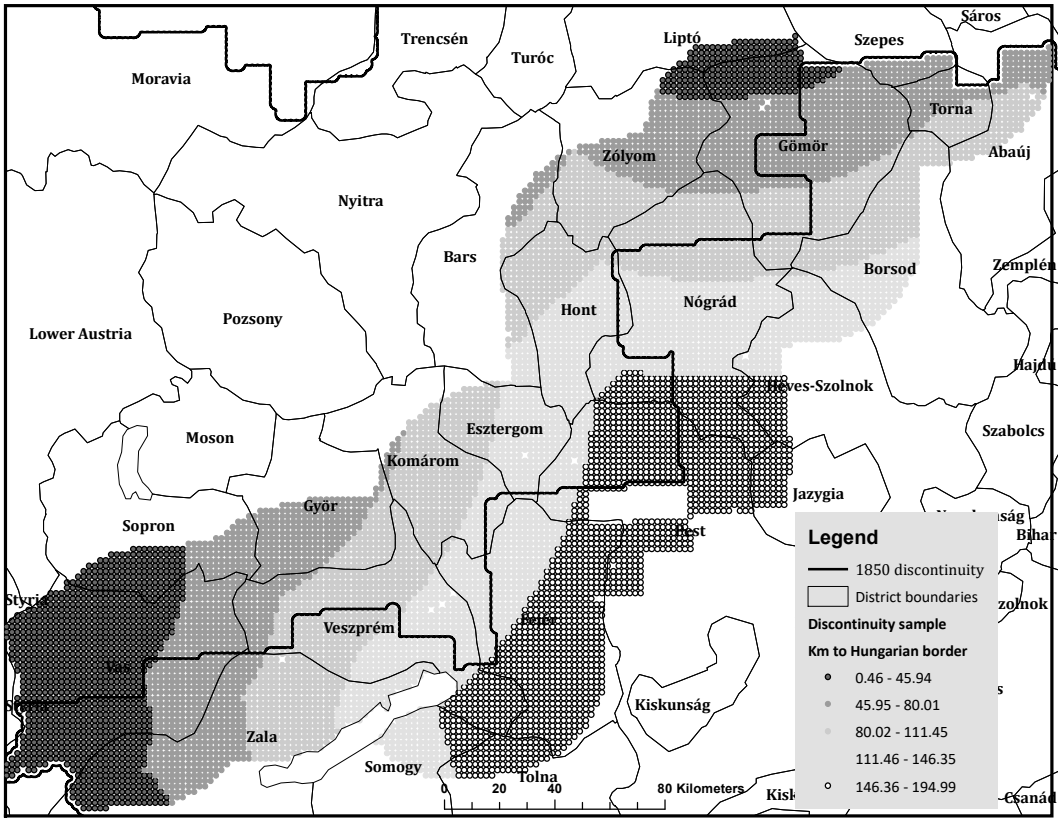
The underlying map comes from section 11, west column XI of the Habsburg Second Military Survey (Timár et al., 2006) and covers what are now the southern areas around Krosno County Poland. The black circles represent the sampled points that comprise our dataset.

Figure E3: Mapping years and agricultural limitations



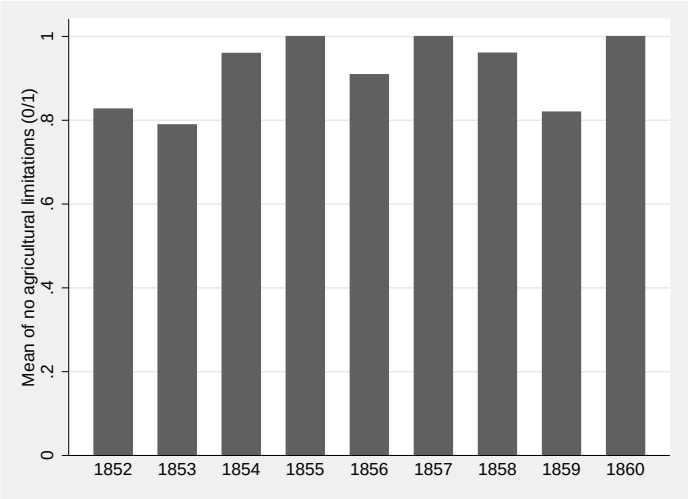
The figure shows the density of land mapped over time with no agricultural limitations (solid line) and with some agricultural limitations (dotted line). Sources: authors' calculations using ESDB (2004) and Timár et al. (2006) historical maps.

Figure E4: Sample for within-Hungary discontinuity estimation



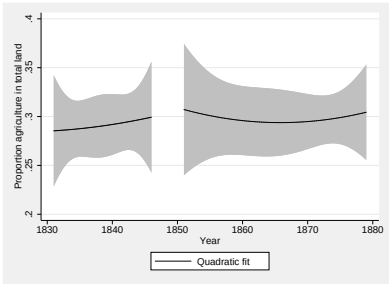
Source: authors' calculations using Timár et al. (2006) historical maps.

Figure E5: Inherent agricultural productivity by year

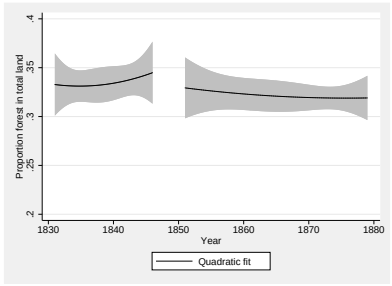


This graph uses the subsample of land in agricultural use after 1850 within the discontinuity window of 40 kilometers. Sources: authors' calculations using ESDB (2004) and Timár et al. (2006) historical maps.

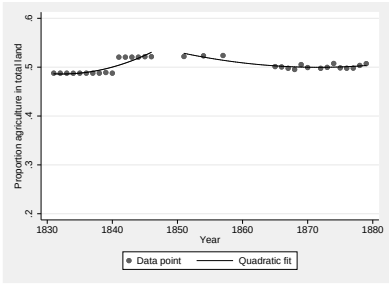
Figure E6: Trends in crop fields and forested area as a percent of total land: 1831-1880



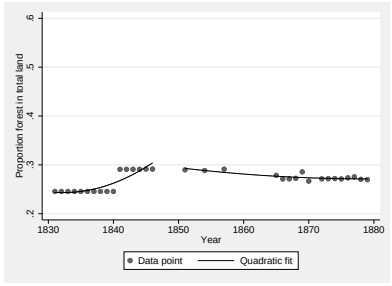
(a) Austria - Crops



(b) Austria - Forest



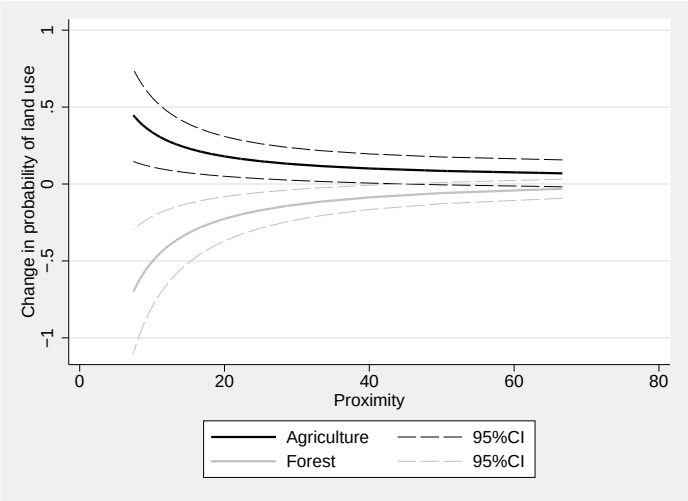
(c) Moravia - Crops



(d) Moravia - Forest

Estimates are simple OLS quadratic fit regressions using data from Habsburg statistical yearbooks (see text for specific sources).

Figure E7: Marginal effects of distance to border on land-use after 1850



Marginal effects and 95% confidence intervals calculated from estimates in columns (1) and (3) in Table 6. Black lines are for agriculture, and gray for forest. Marginal effects for pasture are not shown.