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Unequal Mortality during the Spanish Flu

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Unequal Mortality during the Spanish Flu

Abstract

The outburst of deaths and cases of Covid-19 around the world has renewed the interest to understand the mortality effects of pandemics across regions, occupations, age and gender. The Spanish Flu is the closest pandemic to Covid-19. Mortality rates in Spain were among the largest in today's developed countries. Our research documents a substantial heterogeneity on mortality rates across occupations. The highest mortality was on low-income workers. We also record a rural mortality penalty that reversed the historical urban penalty temporally. The higher capacity of certain social groups to isolate themselves from social contact could explain these mortality differentials. However, adjusting mortality evidence by these two factors, there were still large mortality inter-provincial differences for the same occupation and location, suggesting the existence of a regional component in rates of flu contagion possibly related to climatic differences.

JEL Classification: N34, J1, I14

Keywords: Pandemics, Health inequality, Socio-Economic Mortality Differences, Urban Penalty

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Unequal Mortality during the Spanish Flu

February 2021

BY SERGI BASCO, JORDI DOMÈNECH AND JOAN R. ROSÉS*

The outburst of deaths and cases of Covid-19 around the world has renewed the interest to understand the mortality effects of pandemics across regions, occupations, age and gender. The Spanish Flu is the closest pandemic to Covid-19. Mortality rates in Spain were among the largest in today's developed countries. Our research documents a substantial heterogeneity on mortality rates across occupations. The highest mortality was on lowincome workers. We also record a rural mortality penalty that reversed the historical urban penalty temporally. The higher capacity of certain social groups to isolate themselves from social contact could explain these mortality differentials. However, adjusting mortality evidence by these two factors, there were still large mortality inter-provincial differences for the same occupation and location, suggesting the existence of a regional component in rates of flu contagion possibly related to climatic differences.

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1. Introduction

Mortality rates during modern pandemics are unequal (Bambra et al, 2020; Chen and Krieger, 2021; Feigenbaum et al. 2019; Turner-Musa at al., 2020). Pandemic deaths hit countries, regions, sexes, ages and social classes with a surprisingly large variation in intensity. The timing of the arrival of the pandemic and the precautionary measures can explain a considerable amount of the geographic variation in mortality (Markel et al., 2007). Some intrinsic characteristics of the affected locations like population density and climate can also account for these geographical patterns (Mamelund, 2011; Clay at al. 2018, 2019). Genetic differences or previous immunization to the pandemic shape sex and age mortality differentials (Noymer, & Garenne, 2000). However, social group mortality differences are not easy to explain (Mamelund, 2017). On the one hand, there is co-morbidity caused by living conditions (poor housing, nutrition and sanitation) and social-related illness (Brown and Ravaillon, 2020). On the other hand, poor people could not avoid social contact during pandemic outbursts and, hence, suffer a large proportion of infections (Jay at al., 2020). Furthermore, some jobs have a higher infection, and hence mortality risks, than others.

The main contribution of this paper is to uncover the substantial unequal mortality differentials during the 1918-flu pandemic. Specifically, we consider deviations from historical mortality trends across age, sex, space (provinces and rural versus urban) and occupational groups in Spain. There are several reasons why this country is an excellent natural experiment of the dramatic consequences of this pandemic without pharmacological control. Mortality rates were very high, among the highest in the developed world, and experimented large spatial differences. The population was fully representative of all age groups since the country was neutral during World War I meaning young male adults were not overseas fighting. Instead of what happened in belligerent countries, where information on the pandemic was censored by the military, Spain's population were aware of the spread of the illness and authorities publicised and implemented several measures to fight the pandemic. Finally, the Historical Database of INE (Spanish National Statistical Office) provides disaggregated data on the localisation, sex, age, and occupation of the deceased.

For the flu pandemic of 1918, the broad regional and socio-economic differences in mortality are not fully understood (Herring and Korol, 2012; Mamelund, 2006 and 2018; Økland and Mamelund, 2019; Sydenstricker, 1931; Tuckel et al., 2006; Vaughan, 1920; and Wilson et al. 2014). In most cases, the sparse evidence came from local studies assembling flu-related mortality data at low levels of disaggregation and analysing their correlation with a series of socio-economic indicators at the same level of disaggregation. The typical socio-economic indicators considered are population density, illiteracy rates, homeownership rates, number of rooms per household and unemployment (Grantz et al., 2016; Mamelund, 2006, 2018; Vaughn 1920). Most of these studies point to a strong link between socio-economic indicators and flu-related mortality. Less developed regions tend to have higher mortality rates, albeit the causal link and the specific channel between these socio-economic indicators and mortality differentials are hard to establish (Chowell and Viboud, 2019. Moreover, localised studies can only explain a small part of the overall regional variation in mortality levels (Pearl, 1921; Chowell, Erkoreka et al., 2014).

According to our research, the main features of Spain's flu mortality are the following. First, the mortality differences among different professions are impressive (excess mortality ranged from 102% for miners to 19% for rentiers). Second, these differences are also substantial when we aggregate occupations for socio-economic groups. The high-income group (liberal professions and rentiers) had an average excess mortality rate of 29% compared to 69% in the low-income group (agriculture and mining) and 62% in the mid-income group (industry, trade and transport). These evidence points in the direction that these mortality differentials were related to the higher capacity of certain social groups to isolate themselves from social contact. Third, we also document a female penalty. For example, the excess mortality rate during pandemic peak (October 1918) was 374 per cent for females and 321 per cent for males. Fourth, another defining characteristic of the Spanish Flu is an inverse U-shape in excess mortality rate. The peak was in people aged between 25 and 29. Fifth, the paper undercovers an urban premium with rural mortality rates exceeding urban ones in each occupation during 1918-flu. However, despite this flu-related rural penalty, the overall urban penalty did not disappear, even during 1918 (Reher, 2001). Sixth, using shift-share analysis, we point out that the provincial component explains most of the spatial variation in mortality rates. We also demonstrate that the mortality differentials of certain provinces had a remarkable geographic element (latitude), which may be related to weather differences. Finally, we document a negative correlation of development levels, measured with population density, with excess mortality in occupations in the low-income group.

The rest of the paper is organized as follows. Section 2 reviews the chronology of the flu in Spain and the different non-pharmacological measures taken by public authorities. The following section considers mortality differentials between sexes and among different age groups. Section 4 discusses heterogeneous excess death rates across occupations and rural/urban locations. The subsequent section decomposes them with a shift-share method. The last section concludes.

2. The Spanish Flu in Spain: Chronology and Public Measures

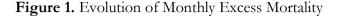
This section will review the basic information on the development of the Spanish flu in Spain. Therefore, we will consider the chronology of the pandemic, how the news on the pandemic spread, and what measures were taken to respond to its development.

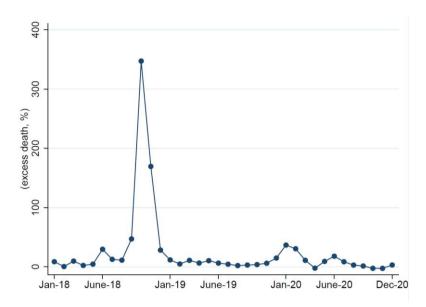
A substantial Spanish Flu literature argues the existence of three waves in this pandemic: a first wave during the summer of 1918; a second one in the fall of 1918 and a third, milder one, during the Winter 1918/19 (See, for example, Chowell, Erkoreka, et al. 2014, for Spain; Pearce et al., 2010, for England and Wales; and Taubenberger and Morens, 2006, for a summary review). To review if this chronology applies to Spain, we will measure the Monthly Excess Death (*MED*_t):

$$MED_t = 100 * \left[\frac{Death \ in \ 1918_t}{Average \ Death \ Pre-1918_t} - 1 \right], \tag{1}$$

where *t* is the Month when average death pre-1918 is calculated as average deaths between 1911 and 1917. Note that this measure of excess mortality rate accounts for potential seasonal mortality effects and controls for age differentials of mortality.

An alternative approach is to calculate mortality rates using the official registrar declaration of the cause of death. These data are available for Spain and have been used previously by Chowell, Erkoreka et al. (2014). However, this information has problems. In the early 20th century, the cause of death was recognized by the symptoms since no test of flu-infection existed. Therefore, it is likely that doctors were underreporting flu-related mortality at the beginning of the pandemic and exaggerating its impact during its later phases. The disparate behaviour of the different local doctors and registrars influenced the reporting of the mortality cause. As a comparative assessment, the Spanish registrars identified in 1918 a total of 147,114 flu deaths and 117,778 deaths caused by other respiratory problems, which some authors directly attributed to flu. Instead, with our method, the total figure of excess deaths is 245,406. For the record, the Spanish registrars detected 7,749 flu deaths and 44,463 caused by other respiratory problems in 1917.





Source: Historical Database of the Spanish National Institute of Statistics (INE).

Figure 1 represents the overall series of monthly excess mortality. Our data partly confirms the presence of three waves albeit the second is several times bigger than the other two.¹ We can observe a small peak in June of 1918 (excess mortality was around 30 per cent), which, maybe, could be labelled as the first wave. The second wave started in September, reaching a peak in October and bottoming up in December. Quantitatively, the peak in excess mortality in October is shocking. The number of deaths more than quadrupled those commonly observed in October (to be precise, the increase was 347 per cent). Even though excess mortality in November was significantly lower than in October, it still implies that the number of deaths more than double those typical in November (169 per cent increase). There is no sight of the third wave in the winter of 1918/19. Indeed, the only "wave" after October 1918, it is a spike in January of 1920, which seems farfetched to consider it the third wave of the Spanish Flu. A plausible explanation for the small significant third wave in Spain is that the fall wave was so intense and the exposure so widespread that inhabitants gained immune protection (Barry et al., 2008; and Pierce et al., 2010).

¹ Chowell, Erkoreka et al (2014) also claims the presence of three waves in the flu in Spain. However, the Spanish evolution of the pandemic it is clearly different to the English and Wales' one (figure 1 in Pierce et al., 2010), where the three waves are clearly visible at first sight, with the peak in excess mortality in the third wave of around half the second.

Contrary to what happened in the belligerent countries, the Spanish press regularly informed on the pandemic. To illustrate the evolution of the presence of the flu in the media, Figure 2 displays the timeline of mentions to "epidemic" and "grippe" (the French word for flu typically used in Spain) in the leading Barcelona newspaper, *La Vanguardia*, (hereafter *LV*).

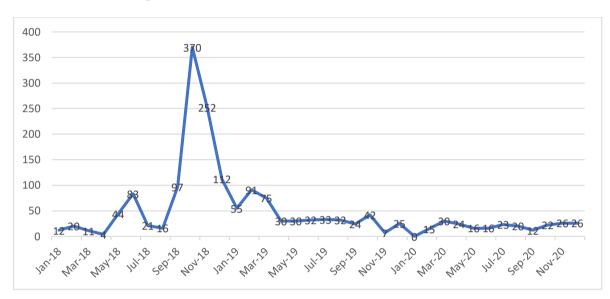


Figure 2. Evolution of Flu-Related Mention in the News

Notes: Times the word "epidemic" and "grippe" are mentioned in LV, from January 1918 to December 1920. **Source:** Underlining data has been obtained from LV's online newspaper library https://www.lavanguardia.com/hemeroteca.

As we can see, there was a mild increase in newspaper hits for these two words in April, which peaked in June 1918 at around seven times the value in January. Although the disease had diffused widely among military cadets and the army cancelled their yearly parades, the mood in May 1918 was optimistic.² On 25th May 1918, the famous doctor Gregorio Marañon noted that all the pandemic cases had a favourable evolution in Madrid and it was a "mild" flu epidemic.³

² El Restaurador, 22nd May 1918: 3; Diario de Cádiz, 23rd May 1918: 3.

³ *LV*, 25th May 1918, p. 8).

However, newspapers informed that many workers were ill in Madrid (tram drivers, doctors, postal office and health inspectors) and Granada (textile workers).⁴

The number of hits declines during the summer coming back to the start of the year figures. The series started to grow exponentially in September, reaching in October a value 30 times larger than the first months of the year. After the peak in October, the series slightly declined in November: the number of hits was still 20 times larger than in January. The number of hits continued to fall in the Winter. During the first months of 1919, the number of hits was around eight times larger than one year before but substantially lower than the peak in October 1918. After March 1919, the presence of flu-related words declined again, and it seems to stabilize to a value slightly larger than the start of the sample. In sum, the pandemic news and its mortality followed a similar pattern.

The Spanish newspapers also report, with substantial detail, the measures taken by the authorities to control the pandemic. In each province, the prefect (the highest government political authority) and the health commission ("Junta Provincial Sanitaria") could officially declare the existence of a pandemic and implement different measures.⁵ On broad terms, the contemporary scientific understanding of contagion channel was reasonably accurate. The main official recommendations were avoiding crowded and poorly ventilated spaces, multitudes and washing hands often. The authorities cancelled many festivals and local fairs and holidays.⁶ Primary and secondary schools, seminaries, high and technical schools and universities did not re-open after the summer harvests and festivities.⁷ Dance and music halls and theatres were closed. The government also cancelled the Military replacements to limit the contagion by infected conscripts to other soldiers.⁸ In prisons, sick prisoners were isolated and given medical treatment. However, there is scarce evidence of the wearing of masks, and no evidence of strict lockdowns and the closing of establishments, workshops and stores (except when all their workers were sick) enforced by authorities. Similarly, harvests took place since we cannot observe an agricultural production

⁴ La Correspondencia de España, 24th May 1918, p. 4. In Granada, for example, many women employed in the textile sector had fallen sick, in some cases forcing some establishments to close completely as all personnel was sick (*LV*, 2nd June 1918, p. 14).

⁵ For example, in the province of Valladolid, LV, 2nd October 1918, p. 14.

⁶ *LV*, 29th September 1918, p. 17.

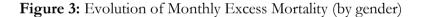
⁷ LV, 29th September 1918, p. 17; LV, 1st October 1918, p. 12.

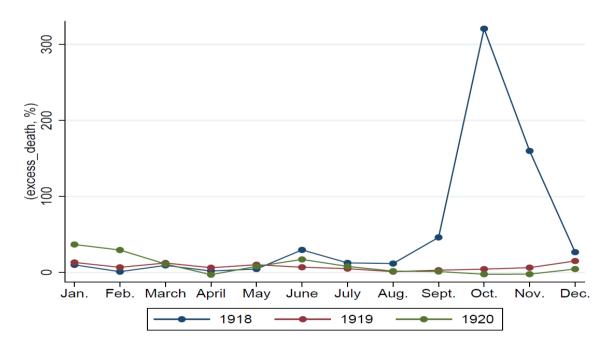
⁸ LV, 19th September 1918, p. 15; LV, 1st October 1918, p. 12.

decrease (Basco et al. 2021). All in all, these set of measures denote the existence of some prior, accumulated knowledge of dealing with epidemics, especially in urban settings (Rodríguez-Ocaña, 1994).

3. Inequality in mortality among sex and age groups

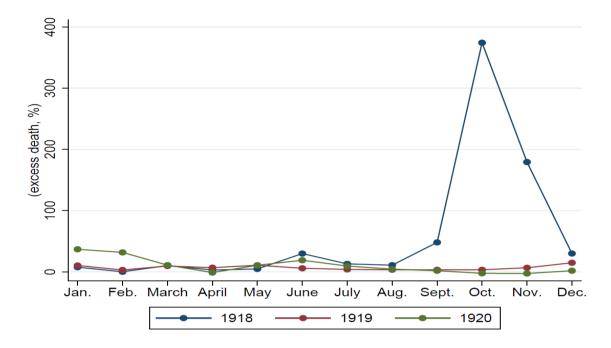
In this section, we will discuss the heterogeneity mortality across sex and age groups. Employing the same methodology than Figure 1, Figure 3 considers monthly excess mortality. The same pattern is apparent for both males and females. There was a large increase in excess death in October, followed by a less secondary peak in November, and no other month with significant death rates. However, another feature of Figure 3 is that excess mortality was higher for females. In October 2018, the excess death rate was 321 per cent for males (Panel A) and 374 per cent for females (Panel B). Overall, it was a female penalty: the total excess female mortality was 57 per cent while the male one was only 51 per cent.





a) Male

b) Female



Source: See Figure 1.

Figure 4 reports the excess death rates by age group and gender (see Table 1A at the appendix for the actual numbers). Excess death rates follow an inverse U-shape: they were lower for children and older adults than young people. The age-group with the higher mortality rates was the age-group from 25 to 34 years old. This age-group has an excess death rate of above 200 per cent. In contrast, people above 55 years old had an excess death rate of below 40 per cent. These findings on relatively lower excess mortality for older adults are consistent with previous evidence on the Spanish Flu (Schoenbaum, 1996; Luk et al. 2001). The literature has argued that it was likely that older adults had already gone through other flu episodes and had acquired immunity to this flu pandemic.

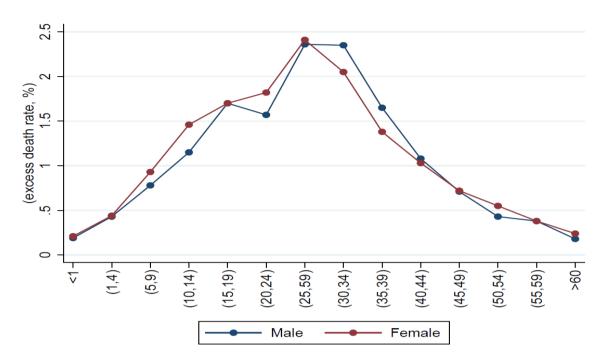
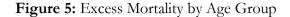


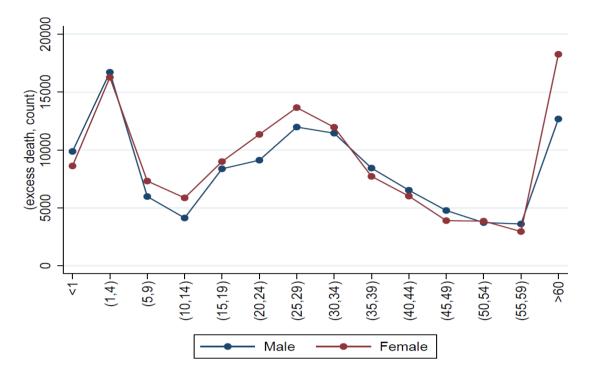
Figure 4: Excess Mortality Rate by Age Group

Source: See Figure 1.

If we focus on the absolute number of excess deaths (rather than the excess rate), the pattern changes. Figure 5, and Table 1A, reports the distribution of the number of excess deaths across age groups. We now obtain a clear W-shape, with three identified peaks: (1) children aged between 1 and 4 years; (2) adults between 25 and 29 years old; and (3) elders with more than 60 years.⁹ However, as we have seen in Figure 3, the second group was the only one in which excess death rate increased dramatically in 1918. In other words, children and older adults had already higher mortality before the pandemic and, thus, a large increase in the overall number of deaths resulted in a relatively small increase in their excess death rates. Taubenberger and Morens (2006) argue that Spanish Flu W-shape has not been documented for any other pandemic since excess deaths in pandemics take a U-shape form.

⁹ Taubenberger and Morens (2006) obtained the same pattern for the United States.





Source: See Figure 1.

4. Heterogeneous Excess Death across Occupations considering urban-rural locations.

This section reports the main results of the paper. We examine the potential heterogeneity of excess mortality (following the equation 1) during the Spanish Flu across occupations and gender separately by urban and rural locations. Furthermore, we also aggregate mortality in 3 different income groups. The following table 1 reports the occupational mortality rates by gender and urban and rural settings.

		Urban			Rural			Overall	
	Male	Female	Total	Male	Female	Total	Male	Female	Total
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Panel A (occupations)									
(i) Agriculture	51.98	43.81	51.49	73.15	50.86	69.13	72.41	50.79	68.59
(ii) Mining	58.67		58.67	105.82		105.82	101.80		101.80
(iii) Industry	39.05	31.04	38.48	68.44	52.48	67.32	60.94	46.93	59.95
(iv) Transport	53.42		53.21	90.43		90.48	81.44		81.43
(v) Trade	6.70		3.62	57.75		50.55	42.52		37.23
(vi) Armed forces & Police	95.06		95.06	104.69		104.69	99.72		99.72
(vii) Administration	12.02		12.45	50.74		50.55	36.61		36.65
(viii) Liberal Professions	34.54	26.75	32.77	59.56	41.83	55.94	51.14	36.29	48.00
(ix) Rentiers	16.95	-5.86	13.60	17.42	29.62	19.47	17.35	24.71	18.56
(x) Domestic Workers	25.98	54.00	53.87	65.05	78.87	78.84	49.65	73.51	73.45
(xi) No Occupation	47.37	62.99	47.48	62.95	104.73	65.64	57.47	102.42	59.49
(xii) Unknown/Non-productive	32.83	26.04	29.95	42.01	43.11	42.51	40.04	39.81	39.94
Overall	38.57	41.55	40.01	54.69	61.51	58.05	51.77	57.63	54.49
Panel B (income groups)									
(a) Low-income	52.17	43.81	51.68	73.51	50.86	69.47	72.76	50.79	68.92
(b) Mid-income	38.74	24.95	37.93	71.59	45.54	69.97	63.18	40.48	61.79
(c) High-income	26.41	15.81	24.37	30.13	33.95	30.81	29.31	29.66	29.37
Overall	38.30	21.67	36.55	68.12	48.41	64.87	65.24	46.81	62.30

Table 1: Excess Mortality by Occupation, income, location and sex in 1918 (per cent)

Notes: Urban are deaths in the provincial capital while rural are deaths in the rest of the province. Spanish literature uses the same definition of the urban and rural population (Reher, 2001). The official statistics classified children as non-productive. There are very few women working in the transport, trade sector and administration; so, their data is not presented but considered for overall calculations. Agricultural and mining workers make the low-income group. Workers in industry, trade and transport make the mid-income. Liberal occupations and rentiers make the high-income one. We do not consider in Panel B domestic workers, armed forces & police, no occupation and unknown, and non-productive given uncertainty on their income levels.

Source: See Figure 1.

Looking at Panel A (column 9), we observe that the occupations for which excess mortality increased the most were workers in mining, armed forces & police, and transportation (with increased death rates above 80 per cent). These results seem consistent with the view that flu contagion was higher in occupations in which people were in close contact. Workers in the mineral sector had the additional disadvantage of working in places with poor ventilation, where it has been shown there is faster diffusion of the virus (Brundage and Shanks, 2008). Similarly, people employed the armed forces & polices, and transportation had to move across villages and, arguably, had high exposure to the flu. Also, the military personnel lived in barracks sleeping in

communal dorms, which facilitated the spread of the flu. On the other side of the mortality spectrum, one can observe the lowest mortality rates among rentiers (only 18 per cent). It is plausible that rentiers were more aware of the dangers of the flu, were not forced to leave the house to work, and kept social distancing.

Although the occupational differences were staggering, there are two potential sources of bias in our analysis exacerbating the occupational mortality differentials. First, age is a concern since it is likely that rentiers were older than other workers and we have shown in the previous section that the group between 20 and 50 years was the group with the highest mortality. Second, geography is another potential source of bias because mining was only present in some parts of the country. However, the evidence presented in panel A provides strong evidence that the occupation affected the probability of contagion and, thus, excess mortality.

A plausible interpretation of panel A is that workers in high-income occupations had the economic means (savings) and knowledge to better shield against the pandemic. To give further support to this interpretation, we classify occupations in three income groups: (a) low-income, (b) mid-income and (c) high-income. Panel B reports excess mortality in 1918 for each of these groups. It becomes apparent from the table that high-income occupations have substantially lower excess mortality. Quantitatively, excess mortality in 1918 was 29 per cent higher than their historical average among high-income workers. The increase in mortality was higher among low-and mid-income occupations with 69 per cent and 62 per cent, respectively. Since in panel B, we are aggregating occupations, the concerns on the biases introduce by age and geographically concentrated mortality diminish.

The dataset contains information on the number of deaths by occupation decomposed between males and females. We report these computations in Table 1, Panel A, columns 7 and 8. The goal of this exercise is twofold. Firstly, we want to compare the influence of gender on our estimates of excess mortality by occupation. In other words, we want to test if females had more mortality performing the same job as males. Secondly, we use the excess mortality differentials by gender as a robustness check of the result that high-income occupations had low excess mortality. It is important to note that a relevant characteristic of Spanish labour markets in the 1910s was the substantial segregation by gender: men were rare in the domestic sector while females were scarce, or absent, in mining, transport, trade, armed forces & police, and administration (Nicolau, 2005). Another problem was that census officials classified many female agricultural workers as no occupation or domestic workers (Gil Ibáñez, 1978) We conclude from this exercise that higher female mortality was mainly due to a compositional effect. On the one hand, mortality was higher in the two "female" occupations (domestic workers and the group with no reported occupation). On the other hand, male mortality was higher in occupations with the two sexes (agricultural, industry and liberal professions). The only exception is rentiers, for which female mortality was higher than male mortality. Similarly, in Panel B, where we group occupations in three large income groups, we observe a very similar mortality pattern for male and female, which is consistent with the aggregate numbers discussed above. Females and males working in high-income occupations. The numbers for high-income occupations are almost the same for males and females. Excess mortality is high for males in low- and mid-income industries, which is partly due to the overrepresentation of males in some occupations.

We now turn the descriptive analysis of the heterogeneity between urban and rural locations (Table 1, columns 1 to 6). The consensus in the literature is that there was an urban penalty in mortality during industrialization. Urban mortality was higher until the discovery of pharmaceutical measures and large investments in urban sanitation (e.g., Cain and Hong, 2009; Evans, 2006, and Haines, 2001). In Spain, the urban penalty was present, at least, until the Spanish Civil War but it was lower than in other European countries (Reher, 2001; Ramiro and Sanz 1999; García Gómez, 2016). This urban penalty was higher among working-classes and was clearly observable in heights of conscripts (Martínez-Carrión and Moreno-Lázaro, 2006). The main causes of it are purely structural: poor sanitation, inadequate housing, food quality and harsh working conditions (Escudero and Nicolau, 2014). In pandemics, overcrowding in cities should lead to more contagion and thus higher mortality (Haines, 2001). However, people in the cities may have better information on the evolution and dangers of influenza, they might take more stringent social distance measures, this reducing contagion and mortality. Furthermore, income and wages were higher in Spanish cities than in the countryside (Rosés and Sánchez-Alonso 2004) and, hence, urban workers could have more savings to keep the social distance.

When looking at the urban-rural mortality differentials, our results are very consistent: the rural mortality premium is higher across all different occupations for male and female deaths. For example, among workers in the industry, rural locations had 75 per cent higher excess mortality rate than cities. For the rest of the occupations, the rural excess mortality in male and female was between 40 and 70 per cent higher. Given that this urban mortality advantage was not due to structural health factors, it is likely that social distancing measures played a substantial role in these

death differentials. Furthermore, these results also cast doubts about the hypothesis that previous sanitary or health conditions were decisive for mortality rates.

Next, we turn our income-group classification in Panel B. As expected, the differences in this table are lower than the counterparts in Panel A. However, we observe substantial heterogeneity: High-income occupations were the ones for with the smaller urban mortality advantage in the cities. One potential explanation is that high-income occupations in rural and urban areas had enough information and resources to remain isolated and shielded against the flu. Interestingly, the largest urban advantage is in mid-income occupations (industry, trade and transport), although there is very limited evidence of factories closures.

5. Decomposing flu mortality

In this section, we will employ a shift-share analysis and a basic regression framework to disentangle some factors behind the spatial differences in Flu mortality across Spanish provinces. Specifically, we decompose the change in the number of deaths per inhabitant in province c and occupation o as,

$$\Delta Death_{c,o} = Aggregate_{c,o} + Rural_{c,o} + Urban_{c,o} + Province_{c,o}, \quad (2)$$

where,

$$\begin{split} Aggregate_{c,o} &= Total \ Death_{c,o,Pre-1918} * \Delta Death_{Spain,Total} \\ Rural_{c,o} &= Rural \ Death_{c,o,Pre-1918} * (\Delta Rural \ Death_{Spain,o} - \Delta Death_{Spain,o}) \\ Urban_{c,o} &= Urban \ Death_{c,o,Pre-1918} * (\Delta Urban \ Death_{Spain,o} - \Delta Death_{Spain,o}) \end{split}$$

Note that the *Aggregate Component* represents the increase in the number of deaths arising from the aggregate national effect of the flu in Spain, which is akin to a year fixed effect. The *Rural Component* represents the increase in the number of deaths since there were a rural penalty and controls for rural occupations. As we have seen, for the same occupation, mortality was higher for workers in that occupation outside the capital or main city. The *Urban Component* is the analogous of the rural component. Finally, the *Province Component* is the residual component and represents the specific mortality of the province in a particular occupation. Analytically, the Province Component is:

 $Rural Death_{c,o,Pre-1918} * (\Delta Rural Death_{c,o} - \Delta Rural Death_{Spain,o}) +$

+ $Urban Death_{c,o,Pre-1918} * (\Delta Urban Death_{c,o} - \Delta Urban Death_{Spain,o}) +$

+ $Total Death_{c,o,Pre-1918} * (\Delta Death_{Spain,o} - \Delta Death_{Spain,Total}).$

Since we are interested in total excess mortality, note that the third term cancels out. That is, when o=total, the third term is zero.

Table 2A at the appendix reports the numbers. We report X_c for each province *c*, where $X_c = \sum_o X_{c,o}$ for $X = \{Aggregate, Industry, Province\}$. Note that in this exercise we control for the size of the population. The most important component to explain the increase in the number of deaths in each province is the Aggregate Component. Specifically, it explains about 95 per cent of the variation in provincial deaths.

The following figure 6 reports the importance of all components except the aggregate component for the relative number of deaths in each province.

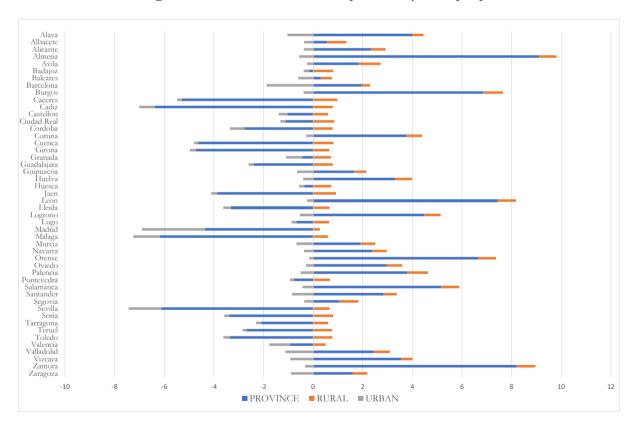


Figure 6: Three Shift-Share Components by 1000 people

Notes: See the text for the definition of the aggregate, industry and province components. **Source:** Appendix Table 2.A.

Several results stand out from this figure. The urban (grey bar) and rural (orange bar) components pull in opposite directions, as predicted. The urban component reduced mortality, so

more urbanized provinces had less flu-related mortality, while the contrary holds for the rural component: more rural provinces experienced greater flu-related mortality. However, the most relevant component in the graph is the province component (blue bar). There are substantial differences across provinces: its average value is 0.48 and the standard deviation is 396 per cent.

Given its essential importance in explaining differences in mortality rates across provinces, it is worth exploring the province component further. The five provinces with the lowest (negative) province component were Cádiz (-6.38), Málaga (-6.18), Sevilla (-6.11), Cáceres (-5.29), and Girona (-4.71). On the other extreme, the five provinces with highest province component were Almería (9.11), Zamora (8.19), León (7.42), Burgos (6.85) and Orense (6.65). Interestingly, provinces in each group are mostly co-located. The following map (Figure 7) confirms the spatial nature of the province component.

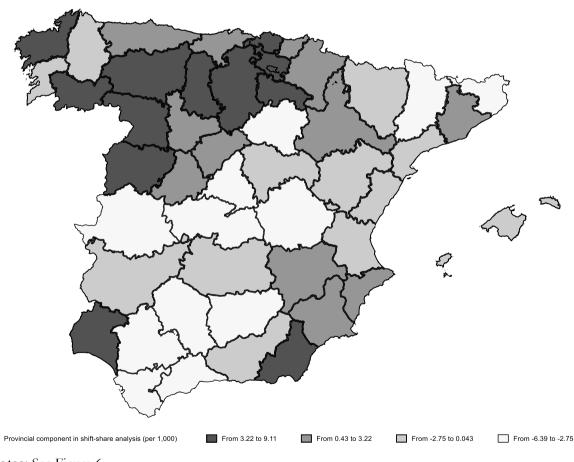


Figure 7: Province shift-share component (by 1000 people)

Notes: See Figure 6. **Source:** Appendix Table 2.A

This map confirms the geographical component of flu mortality: most of the worst affected provinces were in the Northwest of Spain and the least affected in the Guadalquivir Valley and South Castile. However, we can also observe other salient peculiarities: the relatively high impact in the mining-intensive provinces (Almeria, Huelva and Biscay) and the lesser impact of the pandemic in the most urbanized provinces (Madrid, Barcelona, Valencia and Seville).

To explore further the previous results, we perform a regression analysis of the province idiosyncratic component separately for each income group. In other words, we investigate if each income group has different behaviour and if the geographical component is robust. Specifically, we consider OLS specifications of the following form,

$$EM_P_c = \alpha + \beta X_c + \varepsilon_c, \tag{3}$$

where EM_P_c is the province component of excess mortality, weighted by population in order to avoid Heterokedasticity, and X_c are the provincial characteristics. Finally, note that since we focus on the province components, equation (3) is akin to performing a regression with industry and time fixed effects. That is, we removed the variation driven by sectoral composition and the aggregate effect.

	Low-income	Mid-income	High-income	Total	Adults
	(1)	(2)	(3)	(4)	(5)
Density	-14.46***	1.32	-0.03	-6.67	-11.49
	(4.26)	(0.96)	(0.74)	(13.56)	(7.41)
Longitude	-0.47	-0.17	-0.09	-0.61	0.45
	(0.71)	(0.16)	(0.07)	(2.02)	(1.36)
Latitude	1.27*	0.15	0.13	7.69***	3.97**
	(0.65)	(0.13)	(0.097)	(2.66)	(1.54)
No Obs.	48	48	48	48	48
\mathbb{R}^2	0.23	0.14	0.05	0.21	0.16

Table 2: Determinants of the Province effect

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

Sources: Appendix Table 2.A.

Table 2 reports the coefficients of running equation (3), with robust standard errors in parenthesis, when considering different occupational groups. Our independent variables are the density of the province in 1910, longitude and latitude.¹⁰ Column 1 considers excess mortality in the low-income group. For this group, the coefficient of population density is negative and statistically significant. This result implies that provinces with higher population density (a proxy

¹⁰ We also run several robustness regressions including more variables (GDP per capita, inequality and Population) and with Conley Spatial Standard Errors. The results confirm our views of table 2 but Latitude lost significance. These calculations are available in the appendix, Table 3A.

of urbanization and economic development) had less excess mortality in low-income occupations (agricultural and mining workers). Quantitatively, the effect is important: a one standard deviation increase in population density reduces the province component of low-income mortality by 50 per cent (-14.61*0.034). In this case, another relevant variable is the latitude, albeit significant only at 10 per cent.

We consider medium and high-income occupations in column 2 and 3, respectively. In these two cases, none of the variables is significantly different from zero. One interpretation is that these individuals employed in mid- and high-income occupational groups were shielded from the flu in all provinces. Finally, when we consider overall excess mortality (column 4), we notice that only the latitude coefficient is statistically significant and quantitatively important: a one standard deviation in latitude reduced the province component of mortality in 1918 by 170 per cent (-7.69*0.22). Thus, it seems that being in the South helped substantially to prevent an increase in mortality during 1918, as confirmed previously by figure 7. A growing literature has highlighted latitudinal and climatic variations in contemporary influenza epidemics and pandemics (e.g., Alonso et al. 2007; Bloom-Feshbach at al. 2013; Tamerius et al. 2013), and in the severity and timing of the 1918-flu (Chowell, Erkoreka, et al. 2014; Chowell, Simonsen at al. 2014; Reyes et al. 2018).

6. Concluding Remarks

In this paper, we have documented the unequal effects of pandemics on mortality across different dimensions. This question has received renewed interest after the outburst of Covid-19. We have focused on the mortality consequences of the Spanish Flu in Spain (1918). By using a historical episode, we have the advantage of examining a fully completed event. Also, Spain in 1918 resembles a current developing economy in which social distancing is difficult due to budget constraints, which can help us to extrapolate it to the effects of Covid-19 to developing countries.

Our main result is that the excess mortality rate in 1918 substantially varied across occupations from 102% for miner workers to just 19% for rentiers. One interpretation is that whereas rentiers, and other workers with middle incomes and high ones, were able to isolate, less affluent workers were not and continued with their normal daily activities. Perhaps surprisingly, we also document an urban premium. Indeed, excess mortality was lower in the capitals of provinces for all occupations. When analysing the determinants of excess mortality, we find that latitude is the main explanatory variable for overall mortality. For low-income workers, population

density has a negative correlation with mortality. These results are consistent with the presence of this urban premium.

What is the implication of this study for the current Covid-19 crisis? Access to information, health measures and medical knowledge have dramatically improved compared to 1918. Furthermore, the 1918 flu has a substantially different age-related component since the most affected were the young adults. However, a plausible interpretation of our findings is that awareness of the pandemic and isolation seem critical to reduce mortality. Therefore, fully informed individuals who could avoid working outside the home experienced much lower mortality rates. This result strongly resonates with the current socio-economic differences in Covid-related mortality.

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Appendices

				Contribution
		Excess	Excess	to total
		Death	Death	Excess Death
Age	Gender	Rate	Absolute	Rate
<1	Male	19%	9,878	8%
	Female	21%	8,624	7%
(1, 4)	Male	43%	16,717	14%
	Female	44%	16,278	13%
(5, 9)	Male	78%	5,983	5%
	Female	93%	7,320	6%
(10, 14)	Male	115%	4,132	4%
	Female	146%	5,868	5%
(15, 19)	Male	170%	8,376	7%
	Female	170%	9,000	7%
(20, 24)	Male	157%	9,122	8%
	Female	182%	11,348	9%
(25, 29)	Male	236%	11,982	10%
	Female	241%	13,665	11%
(30, 34)	Male	235%	11,454	10%
	Female	205%	11,968	9%
(35, 39)	Male	165%	8,441	7%
	Female	138%	7,724	6%
(40, 44)	Male	108%	6,527	6%
	Female	103%	6,020	5%
(45, 49)	Male	71%	4,777	4%
	Female	72%	3,900	3%
(50, 54)	Male	43%	3,733	3%
	Female	55%	3,857	3%
(55, 59)	Male	38%	3,613	3%
	Female	38%	2,961	2%
over 60	Male	18%	12,680	11%
	Female	24%	18,267	14%
Unknown	Male	48%	357	0%
	Female	56%	278	0%
Total	Male	51%	117,774	
	Female	57%	127,078	

 Table 1A. Excess Death by Age and Gender

Source: See Figure 1.

Components					
Province	Provincial	Aggregate	Rural	Urban	deaths
(1)	(2)	(3)	(4)	(5)	(6)
Alava	3.989	10.897	0.456	-1.041	14.300
Albacete	0.561	13.264	0.777	-0.363	14.239
Alicante	2.328	10.512	0.595	-0.372	13.063
Almeria	9.111	12.825	0.699	-0.563	22.073
Avila	1.840	14.335	0.877	-0.240	16.812
Badajoz	-0.157	13.097	0.800	-0.225	13.515
Baleares	0.300	9.248	0.456	-0.600	9.404
Barcelona	1.952	12.374	0.348	-1.873	12.801
Burgos	6.858	13.670	0.798	-0.385	20.941
Caceres	-5.299	15.648	0.978	-0.180	11.146
Cadiz	-6.385	14.464	0.791	-0.626	8.244
Castellon	-1.038	10.540	0.601	-0.354	9.750
Ciudad Real	-1.109	13.788	0.849	-0.208	13.320
Cordoba	-2.773	14.188	0.784	-0.582	11.617
Coruna	3.754	10.879	0.642	-0.280	14.995
Cuenca	-4.621	13.286	0.823	-0.183	9.305
Girona	-4.719	10.937	0.653	-0.250	6.621
Granada	-0.442	13.400	0.715	-0.651	13.022
Guadalajara	-2.390	12.883	0.790	-0.209	11.074
Guipúzcoa	1.657	9.788	0.482	-0.641	11.286
Huelva	3.308	11.899	0.679	-0.400	15.486
Huesca	-0.362	12.072	0.738	-0.206	12.242
Jaen	-3.856	15.106	0.924	-0.257	11.917
Leon	7.425	12.420	0.751	-0.245	20.350
Lleida	-3.310	11.260	0.658	-0.313	8.295
Logrono	4.478	12.171	0.663	-0.536	16.776
Lugo	-0.674	10.636	0.646	-0.198	10.410
Madrid	-4.366	13.644	0.269	-2.530	7.017
Malaga	-6.182	13.056	0.591	-1.065	6.401
Murcia	1.918	11.512	0.587	-0.669	13.349
Navarra	2.386	10.291	0.582	-0.367	12.892
Orense	6.660	11.520	0.714	-0.158	18.736
Oviedo	2.958	10.822	0.635	-0.293	14.121
Palencia	3.792	14.742	0.840	-0.501	18.872
Pontevedra	-0.769	11.043	0.681	-0.162	10.793
Salamanca	5.159	12.910	0.738	-0.429	18.378
Santander	2.840	11.318	0.531	-0.847	13.842
Segovia	1.058	13.085	0.767	-0.358	14.552
Sevilla	-6.119	15.133	0.664	-1.319	8.360
Soria	-3.386	13.085	0.807	-0.194	10.313
Tarragona	-2.085	10.086	0.606	-0.214	8.393
Teruel	-2.679	12.335	0.765	-0.167	10.254

 Table 2A: Shift-Share Analysis of Excess Death in 1918 by 1000 people

St. Deviation	3.960	1.553	0.144	0.462	3.944
Average	0.481	12.371	0.677	-0.533	12.996
Zaragoza	1.604	12.311	0.584	-0.895	13.604
Zamora	8.197	12.939	0.765	-0.326	21.575
Vizcaya	3.544	10.521	0.461	-0.920	13.606
Valladolid	2.445	14.077	0.646	-1.113	16.055
Valencia	-0.929	10.918	0.506	-0.843	9.652
Toledo	-3.365	12.876	0.779	-0.252	10.038

Source: See Figure 1.

Table 3A: Determinants of the Province effect: Robustness Checks

	Low-income	Mid-income	High-income	Total	Low-income	Mid-income	High-income	Total
	OLS	OLS	OLS	OLS	Conley	Conley	Conley	Conley
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Density	-19.87***	3.52***	1.05	-4.61	-14.50***	1.97***	0.33	3.65
	(5.94)	(1.09)	(0.98)	(20.72)	(4.61)	(0.93)	(0.64)	(12.52)
Population	-0.025	-0.25	-0.30*	-3.30				
	(0.92)	(0.22)	(0.17)	(3.45)				
GDP pc	8.322	-1.85	1.16	33.73				
	(7.65)	(2.08)	(1.62)	(33.12)				
Inequality	-0.12	-0.01	0.05*	0.87				
	(0.26)	(0.03)	(0.03)	(1.00)				
Longitude	-0.91	-0.06	-0.06	-1.02				
	(0.92)	(0.23)	(0.13)	(3.67)				
Latitude	1.34*	0.11	0.03	6.16*				
	(0.77)	(0.15)	(0.12)	(3.45)				
\mathbb{R}^2	0.27	0.25	0.12	0.23	-	-	-	-
No Obs.	48	48	48	48	48	48	48	48

Notes: * p < 0.10, ** p < 0.05, *** p < 0.01. Sources: See Table 2. For Population, GDP pc and Inequality, Rosés at al. (2010).