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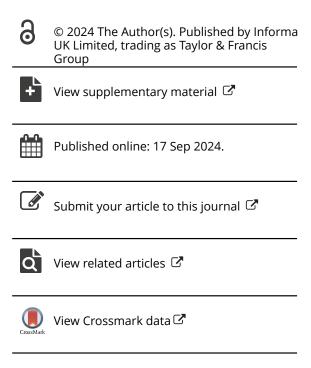
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Spatial disparities in cause-specific mortality in Ukraine: A district-level analysis, 2006–19

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Turbulent socio-economic development, recent political challenges, and remarkable regional diversity with deep historical roots make Ukraine an important case study for understanding mortality trends in Eastern Europe. In this paper, we provide the first comprehensive, spatially detailed analysis of cause-specific mortality trends and patterns in Ukraine, focusing on the period 2006–19. We rely on official mortality data and use various demographic and spatial analysis techniques. Our results suggest a notable attenuation of the long-standing West–East and West–South–East mortality gradients. Cardiovascular mortality at older ages largely explains the gap between the vanguard (lowest mortality) and laggard (highest mortality) areas, especially for females and in the most recent period. By contrast, the impact of mortality from external causes has greatly diminished over time. Hotspot analyses reveal strong and persistent clustering of mortality from suicide, HIV, and lung cancer. Further research should focus on in-depth assessment of the mechanisms causing the observed patterns.

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Keywords: Ukraine; regional mortality; causes of death; spatial patterns; mortality disparities; district-level analysis

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Introduction

The vast amount of research conducted in recent decades has led to considerable progress in our understanding of the peculiarities of mortality patterns in Eastern Europe (Bobak and Marmot 1996; Shkolnikov et al. 2004; Jasilionis et al. 2011; Grigoriev et al. 2014; Aburto and van Raalte 2018). A combination of different factors—such as excessive alcohol consumption, high smoking prevalence, weak performance of the healthcare system, poor standards of living, and psychological stress due to economic uncertainty—have been identified as

major factors behind the unfavourable mortality trends (Leon et al. 1997; Gilmore et al. 2004; Shkolnikov et al. 2004; Brainerd and Cutler 2005; Grigoriev et al. 2010; Trias-Llimós et al. 2018; Trias-Llimós and Janssen 2018).

Compared with the large amount of evidence from studies of national populations in countries of the former Soviet Union (hereafter FSU countries), less is known about subnational mortality patterns. This is particularly the case for Ukraine, which is generally internationally under-represented in comparative mortality research. While historical events such as the 1932–33 famine (also known as the

Holodomor genocide) have been the focus of several studies (Meslé and Vallin 2012; Rudnytskyi et al. 2015; Applebaum 2017), less attention has been paid to recent spatial mortality trends and patterns. This is an important omission, given that Ukraine has experienced several dramatic events in recent decades, many with explicit spatial dimensions. These include the Chernobyl disaster of 1986, the post-communist transition crisis after the collapse of the Soviet Union, and the aggression of the Russian Federation against Ukraine, which started in 2014 with the annexation of Crimea and the war in eastern Ukraine and continued with the full-scale invasion on 24 February 2022.

The aim of this study was to conduct the first comprehensive, spatially detailed analysis of cause-specific mortality patterns in Ukraine. In this paper we focus on the assessment of spatial mortality patterns at a detailed level (districts; *rayons*) during 2006–19 and complement this analysis with an overall assessment of cause-specific mortality trends at a higher level (regions; *oblasts*) since 1990.

Background

The collapse of the communist system and the dissolution of the Soviet Union into 15 independent states in 1991 resulted in a deep socio-economic crisis, which in turn had adverse consequences for population health (Brainerd 1998; Cornia and Paniccia 2000). Large parts of the populations of FSU countries were faced with falling living standards, erosion of the healthcare and social security systems, rising unemployment, and widening income inequalities. These circumstances caused psychological stress and the rapid spread of unhealthy behavioural patterns, with excessive alcohol consumption being most prominent (Cockerham 1997; Bobak et al. 1998, 2000; Shkolnikov et al. 2004; Brainerd and Cutler 2005). The unprecedented increase in mortality in the newly established FSU countries in the early 1990s resulted in a further widening of the long-standing East-West mortality gap in Europe (Bobak and Marmot 1996).

Given the past similarities among FSU countries in terms of historical and socio-economic developments, summarizing scientific knowledge on subnational mortality patterns in this world region is important for understanding contemporary subnational mortality patterns and differentials in Ukraine. In this section, we first focus on the similarities and peculiarities of subnational mortality

patterns in FSU countries. Then we turn to an overview of existing evidence on mortality trends and patterns in Ukraine.

Subnational mortality trends in FSU countries

Previous studies on subnational mortality in Russia, Belarus, Moldova, and the Baltic States have documented substantial mortality disparities with a tendency to persist over time (Kalediene and Petrauskiene 2000, 2004; Vallin et al. 2005; Krumins et al. 2009; Grigoriev et al. 2013, 2016, 2020; Timonin et al. 2020; Shchur et al. 2021; Penina 2022a). Vallin et al. (2005) reported a stark and persistent mortality difference between the southwestern and north-eastern regions of European Russia in both all-cause and cause-specific mortality. The first ever district-level analysis of mortality in Russia confirmed this observation (Timonin et al. 2020). Persistent geographical gradients in mortality have also been documented for several other FSU countries. In Belarus, mortality has tended to be higher in the eastern part of the country bordering Russia (Grigoriev et al. 2013), whereas in Lithuania, men's mortality was found to be higher in the southeastern part bordering Belarus (Grigoriev et al. 2016). For Moldova, Penina (2022a) reported a gradient in life expectancy between the northern districts and the municipality of Chisinau (low mortality) and the belt of districts located mainly in the centre (high mortality).

The very few existing spatial mortality studies conducted across several neighbouring countries have pointed to the relevance of the historic context and former political borders in shaping contemporary mortality patterns. In this regard, it is important to stress that the FSU region has long been characterized by large political entities (e.g. the Russian Empire, the Soviet Union) comprising people of different ethnicities or nationalities. In addition, political borders have frequently shifted, especially in the European part of the FSU. As a result, current national borders in Eastern Europe may be less relevant for understanding spatial variation in demographic behaviour than in Western Europe, where many national borders have a long history (see also Watkins 1991). Grigoriev et al. (2016) identified a large cluster of elevated alcohol mortality among men, stretching across the Belarus-Lithuania national border. The districts which formed this cluster (in north-west Belarus and south-east Lithuania) used to belong to the Vilna province (gubernia) in the Russian Empire and then, until 1939, to Poland. Grigoriev et al. (2020) detected a gradient in men's alcohol-related mortality-from very high levels in north-western Russia to low levels in southern Poland-which was not explicitly demarcated by national boundaries. They identified hotspots of alcohol-related mortality that dominated the territories of north-western and western Russia, eastern and north-western Belarus, south-eastern Lithuania, and eastern and central Poland. These patterns of alcohol-related mortality mirrored those of all-cause mortality, suggesting that excessive alcohol consumption was an important factor in the observed spatial mortality differences.

A distinct feature of mortality patterns in FSU countries is persistent urban-rural disparities, which have tended to widen in recent years in light of growing urbanization and massive depopulation trends in many rural areas. The urban-rural mortality divide, which dates back to Soviet times, is explained by several factors, including poorer socio-economic conditions, poorer access to healthcare, and higher prevalence of excessive alcohol consumption, as well as psychosocial factors associated with the lack of future prospects and entertainment opportunities in rural areas (Jasilionis 2003; Stickley and Razvodovsky 2009). In their district-level analysis of Russia, Timonin et al. (2020) identified Moscow, Saint Petersburg, and several so-called 'science' cities and cities with a special regime (often related to the defence/applied industry) as best-practice areas in terms of the highest life expectancy: life expectancy in these areas was close to the national averages for Poland and Estonia but still substantially below the averages for Western countries. In line with these findings, Shchur et al. (2021) reported growing gaps between larger cities and the 'periphery' within regions of Russia, with a particularly strong increase in disparities between 2015 and 2017. Education and population size were identified as the factors explaining roughly twothirds of subnational variation in life expectancy. Furthermore, for Belarus, Grigoriev et al. (2013) identified a growing advantage of the capital and big cities over other areas as the main driver of rising subnational mortality differentials. Some studies conducted in the Baltic States have also confirmed the growing survival advantage of populations in major cities and urban areas, with differences in cardiovascular and external-cause mortality being mostly responsible for the subnational variation. Unhealthy lifestyles, greater social and psychological stress affecting the rural population, inequalities in healthcare accessibility, and lack of preventative programmes in rural areas were proposed as possible explanations for the observed urban-rural mortality differentials in Lithuania (Kalediene and Petrauskiene 2000, 2004).

Several studies have attempted to assess the role of contemporary contextual factors in shaping spatial disparities. An ecological analysis of factors responsible for the regional mortality variation within Belarus confirmed a strong association between excessive alcohol consumption and allcause mortality (Grigoriev et al. 2013). The same analysis identified unemployment as being strongly associated with cardiovascular and external-cause mortality, whereas poverty was found to be an important predictor of regional disparities in suicide and homicide mortality. Krumins et al. (2009) argued that geographical patterns observed in Estonia, Latvia, and Lithuania were influenced more by socio-economic and cultural factors specific to a given geographic area and linked to the historical context of neighbouring countries than by the fact that areas currently belonged to a particular country.

National and subnational mortality trends in Ukraine

Whereas Ukraine shares many similarities with other FSU countries in terms of general demographic trends, this applies primarily to the eastern part of the country. The western regions of Ukraine seem to be in a transition towards the mortality patterns observed in Poland, the Czech Republic, Hungary, and Slovenia (Menon et al. 2009).

An important event with implications for regional mortality variation in Ukraine was the Chernobyl disaster of 1986, which resulted in contamination of territories surrounding the nuclear power plant situated north of Kyiv at the border with Belarus (Poniakina 2014). Territories further away were also affected by radiation. Following an acute health crisis after the dissolution of the Soviet Union, life expectancy at birth in Ukraine dropped by 4.4 years among males and 2.4 years among females between 1990 and 1995 (HMD 2022). Afterwards, there was a period of short-term recovery in 1996-97, followed by another short-term decline in 1999, after the 1998 global economic crisis. As in many other FSU countries, the drop in life expectancy in the 1990s was driven by increasing mortality at working ages and rising death rates from diseases of the circulatory system and external causes (Steshenko 2001; Meslé and Vallin 2012). Previous

studies have identified deaths from preventable causes, including alcohol- and smoking-related diseases and accidents, as playing a leading role in excessive adult mortality in Ukraine (Libanova et al. 2007; Levchuk 2009). Furthermore, there was a rapid spread of the HIV epidemic across the country in the 1990s and early 2000s, particularly in regions with higher prevalence of intravenous drug use (Zaller et al. 2015; Antonenko and Martsynovska 2022).

Between 2008 and 2013, life expectancy in Ukraine increased. This remarkable improvement has been attributed to reductions in death rates from all major causes, particularly declining mortality from heart diseases (Penina 2022b). The progress was also accompanied by a substantial decline in alcohol-related deaths, due to decreased overall alcohol consumption and the gradual replacement of spirit consumption with beer consumption (Krasovsky 2012; Penina 2017). Compared with the Baltic countries, Belarus, and Russia, the improvement in life expectancy in Ukraine started a few years later, resulting in an increase of 4.0 years among males and 2.3 years among females between 2008 and 2013 (HMD 2022). However, this positive trend was interrupted around 2014 when life expectancy resumed a generally downward trend among males and stagnated among females. This interruption coincided with the start of the Russian invasion of Ukraine which resulted in Russia's annexation of Crimea and the war in Donbas. According to the latest data, life expectancy at birth in 2021 was between seven and nine years lower for Ukrainian men and five or six years lower for Ukrainian women compared with their counterparts in Poland and the Czech Republic (HMD 2022; UkrStat 2023).

These mortality developments did not occur uniformly across all regions of Ukraine. A few studies exploring regional mortality variations have identified persistent health disparities between western and south-eastern Ukraine. Murphy et al. (2013) estimated the contributions of various causes of death to regional differences in life expectancy in 2008. Their results showed that the gap in life expectancy between the eastern and southern regions of Ukraine on the one hand and the western regions on the other (the West-South-East mortality gradient) was due mostly to deaths from infectious diseases and external causes among young adults and to cardio- and cerebrovascular deaths among older adults. Other studies focusing on regional mortality in Ukraine have identified new changes in the country's health divide: lower life expectancy in the north and south, in contrast to higher life expectancy in the western and central regions (Shevchuk 2007; Levchuk and Luschik 2019). However, the above-mentioned studies all analysed subnational mortality variation in Ukraine at a rather high level of aggregation, the region level. Furthermore, they did not provide a detailed analysis of cause-specific mortality, and it remains unclear to what extent the new mortality gradient can be explained by a shift in cause-specific mortality patterns.

A notable exception is the study by Poniakina (2014), who performed an extensive analysis of cause-specific mortality patterns at the region level and complemented it with an assessment of mortality patterns at the district level. In her thesis, Poniakina (2014) concluded that different regions of Ukraine were at different stages of the epidemiological transition (Omran 1971). The western regions of Ukraine have managed to make the most progress towards a modern mortality structure (as displayed by Western European countries), while the eastern and southern regions are characterized by a more traditional mortality structure (high share of digestive and infectious diseases and external causes).

Data and methods

Administrative territorial division

Ukraine's higher-level administrative division consists of 27 units: 24 regions (*oblasts*), the Autonomous Republic (AR) of Crimea and two cities with special status: Kyiv and Sevastopol (Figure 1). Most of these regions' populations lie within the range of 800,000 to 3 million inhabitants, which corresponds with the European NUTS 2 regional level. Only the Dnipropetrovsk region (>3 million inhabitants), the Donetsk region (>4 million inhabitants), and the city of Sevastopol (about 500,000) are exceptions.

For the lower-level spatial units, we relied on a long-standing administrative territorial division at the district (rayon) level, which was in force until 2020. This division consisted of 679 districts and cities. The administrative borders of districts remained mostly unchanged over the period 2006-19. The only exception is that some cities which had been treated as part of a district became separate units. To ensure data comparability, we constructed a time-constant data set in which we merged back all the units that had been separated. Furthermore, to increase the stability of mortality rates, we also merged all cities with a population below 100,000 corresponding their

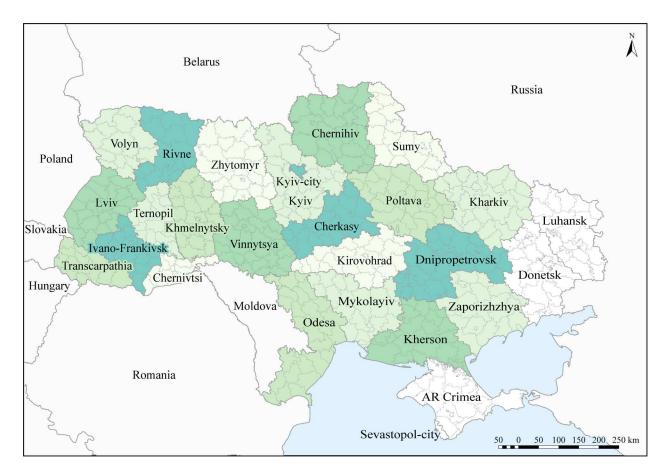


Figure 1 Administrative divisions of Ukraine *Notes*: Donetsk, Luhansk, and AR Crimea (white coloured) regions are excluded from the district-level analysis. *Source*: Prepared by the authors. Base maps: Ministry for Regional Development, Building and Housing of Ukraine; DIVA-GIS portal; Eurostat.

(surrounding) districts. Through these adjustments, we reduced the number of spatial units to 539. These modifications entailed the need not only to merge corresponding mortality and population data but also to edit the shape files used for the spatial analysis. After the complete exclusion of Luhansk, Donetsk, and AR Crimea regions, for which no data have been available since the start of the Russian aggression in 2014, the final number of lower-level spatial units (districts and cities) was 471.

Collected data

Our analysis is based on official regional mortality data and population estimates provided by the State Statistics Service of Ukraine (UkrStat). Overall, we were able to collect data covering the period 2005–19 at the district level for all regions of Ukraine apart from Luhansk, Donetsk, and AR Crimea. Data were missing for a few other regions and periods (Kyiv region for 2009–11, Odesa

region for 2012, Cherkasy region for 2005). The starting point (2005) corresponds to the implementation of the abridged classification of causes of death based on ICD-10. Unfortunately, it was not possible to obtain district-level population estimates as of 1 January 2005 to calculate the midyear population for 2005. As a result, the analyses in this paper cover the period 2006-19. The mortality data originate from the statistical table 'c8r': death counts by year, sex, type of settlement (urban/rural/total), region, administrative district, five-year age group (up to 100+), and cause of death. Until 2008 the Ukrainian abridged classification of causes of death consisted of 249 items and from 2008 onward of 254 items. The data on population estimates originate from the statistical table 'VRN-2MT': population counts by year (as of 1 January), sex, type of settlement (urban/rural/ total), administrative district, and five-year age group (up to 70+). More detailed data were available only for cities with a population above 100,000 and for regions.

The quality of Ukrainian population statistics deserves particular attention. We discuss this issue in detail in the Study limitations subsection.

Methods

First, we reduced the number of causes of death analysed, by aggregating the original (official) list into a short list containing 57 items. This list was developed in the framework of a project aimed at restoring a long retrospective cause-of-death time series. The groups were produced as the most appropriate solution to ensure comparability of major causes across several revisions of the International Classification of Diseases (ICD). The final list of causes of death which we considered in our analysis is provided in the supplementary material (Table A1). To improve the comparability of cause-specific mortality between regions, we redistributed ill-defined deaths across the other (well-defined) causes of death proportionally to their shares of the total number of deaths. This was done separately for each year, sex, region, and age. Additionally, the same approach was applied to events of undetermined intent (EUI) (codes Y10-Y34), which were redistributed between suicide (X60-X84) and assault (X85-Y09, Y35, Y36) to account for the known issue of misclassification of violent deaths, an issue affecting cause-of-death statistics not only in Ukraine (Värnik et al. 2010).

To minimize random variation due to small numbers, we pooled death and population counts across the whole analysed period into three-year sub-periods. Our analysis covers two specific periods: 2006–08 as the starting point and 2017–19 as the final observation point. Based on the official population estimates (for 1 January) we first calculated mid-year populations as the simple average between two subsequent years and then pooled them over the three-year periods. The obtained estimates were used to compute age- and cause-specific mortality rates for each period, sex, and spatial unit. Based on the obtained rates, we calculated the standardized death rates (SDR) using the 1976 European Standard Population as a population standard. To visualize the spatial distribution of cause-specific mortality and its change over time, we produced choropleth maps by selected causes of death using the quantile method of classification. This allowed us to split our spatial units into 10 equal groups (deciles) and is consistent with the subsequent analysis of mortality inequalities.

To measure the degree of regional disparity, we computed various measures of dispersion (both

unweighted and weighted for population size) and calculated regression-based inequality measures, such as the slope index of inequality (SII) and the relative index of inequality (RII). These calculations were performed using the R package PHEindicator-methods (Anderson 2020). To determine the age-and cause-specific components responsible for the mortality gap between the best- and worst-performing districts and cities in Ukraine, we decomposed the difference in the SDR using the algorithm of stepwise replacement proposed by Andreev et al. (2002).

To identify statistically significant *hotspots* and *cold spots* with respectively high and low cause-specific mortality, we relied on the *Getis-Ord Gi* statistic* (Ord and Getis 1995). To conceptualize spatial relationships, we used the *contiguity edges corners* definition of neighbourhood (also referred to as first-order queen contiguity). All spatial data operations, as well as all spatial analyses, were performed using ArcGIS software.

Results

All-cause mortality trends

Figure 2 provides a general overview of regional mortality trends in Ukraine over the last three decades. As in many other countries, regional variation among males has been much higher than among females. We also include information on the min-max range and the standard deviation of life expectancy for selected years. The year 1990 marks the minimum interregional disparity in Ukraine over the whole period of observation, for both males and females. Regional disparities quickly widened during the post-communist transition crisis of the early 1990s, as registered life expectancy declines varied strongly across Ukraine. Particularly remarkable is the capital city, Kyiv, which for both men and women belonged among the vanguard regions (with the highest life expectancy) before 1990. It temporarily lost this vanguard position in the 1990s due to an abrupt drop in life expectancy. By contrast, vanguard regions in western Ukraine (e.g. Lviv region) experienced much smaller declines and were able to keep their vanguard position. However, Kyiv city quickly recovered and was already back in a vanguard position by the late 1990s. By 2000, the mortality gap between the bestand worst-performing regions reached its peak: 7.1 years for males and 4.0 years for females. After a period of rapid improvement (2008-13) in all

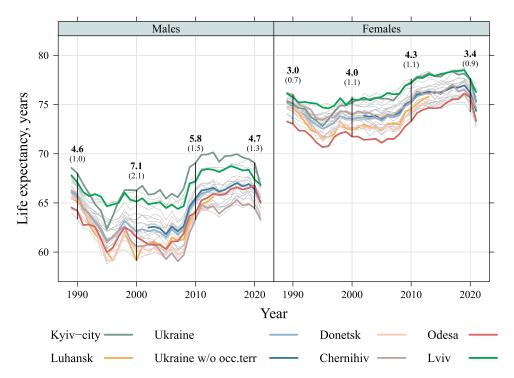


Figure 2 Life expectancy at birth by Ukrainian region, 1989–2021

Notes: Values above the lines are the min–max range and standard deviation (in parentheses). Lines in grey are other individual regions. 'W/o occ. terr' refers to Ukraine without the occupied territories.

Source: Authors' calculations based on official data from State Statistics Service of Ukraine.

regions, the progress decelerated. In some regions, life expectancy started to stagnate and even decline, especially for men. Finally, as a result of the Covid–19 pandemic, life expectancy dropped dramatically in all regions in 2020 and 2021. This decline was accompanied by a declining interregional difference, which fell to near its minimum again as indicated by the min–max range and standard deviation.

Mortality trends by leading causes of death can provide deeper insights into the observed life expectancy trends and patterns. They are shown in Figure 3 (males) and Figure A1, supplementary material (females). It is apparent that overall mortality levels and trends across Ukrainian regions are strongly related to mortality from cardiovascular diseases (CVD). During the last three decades, there were two periods when CVD mortality was declining: (1) between the mid- and late 1990s; and (2) from 2005 to the early 2010s. Whereas the decline in the first period is likely to be attributable to the 'rebound' effect after the transition crisis, in the second period it appears to have been driven by real improvements, indicating signs of the so-called cardiovascular revolution (Grigoriev et al. 2014). However, these positive changes proved to be short-lived: since the 2010s, CVD mortality across Ukrainian regions has been either stagnating or growing again.

Like CVD mortality, trends in external causes of death clearly mirror the trends in all-cause mortality. Yet their importance has notably diminished in recent years as compared with the 1990s and early 2000s. By the end of the observation period, the regional differences in mortality from external causes had converged to a level below that observed in 1990. This was particularly the case for females. The time trends in neoplasms, the second largest cause-of-death group (by number of deaths) in Ukraine, do not correlate with overall mortality dynamics over time. Thus, the time trends in neoplasms stand in stark contrast to those for the other two groups of causes. The reductions in neoplasm mortality were greater during the post-communist crises of the 1990s and early 2000s than in more recent years. These distinctive trends in cancer mortality are likely to be explained by competing mortality from CVD and accidents as well and also by birth cohort effects (Shkolnikov et al. 1999).

As a next step we turn to the analysis of detailed spatial patterns. Figure 4 depicts the spatial distribution of all-cause mortality across 471 districts and cities of Ukraine in 2006–08 and 2017–19. As

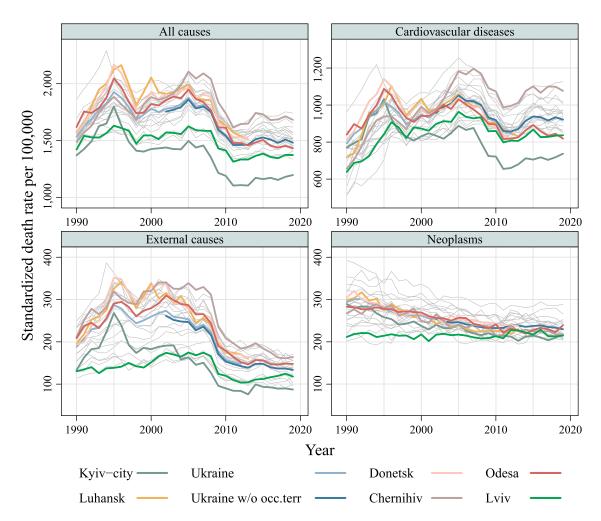


Figure 3 Mortality from leading causes of death by Ukrainian region: males, 1990–2019 *Note*: Lines in grey are other individual regions. 'W/o occ. terr' refers to Ukraine without the occupied territories. *Source*: As for Figure 2.

can be seen, there is no clear east-west mortality gradient but rather an advantage of western Ukraine as compared with the rest of the country. In 2006-08, this advantage was apparent except in part of the western Ukrainian region of Zakarpattia, which exhibited higher mortality, particularly among women. Some mortality hotspots for both men and women were concentrated in areas north of the mortality cold spot Kyiv city, including areas that were most heavily contaminated by the Chernobyl disaster. Another hotspot consisted of areas in southern Ukraine, with a particular focus on Odesa region. Between 2006-08 and 2017-19, the overall spatial pattern did not alter extensively but became more nuanced. First, the advantage of the west became less apparent. This seems particularly the case for the northern part of western Ukraine (Volyn and Rivne regions), which was still a mortality cold spot in 2006-08, at least among females. Second, while most of the districts with high mortality continued to be in the north and the south of the

country, a belt of low mortality emerged in central Ukraine.

Assessing subnational mortality disparities

As the next step, we quantify the degree of subnational disparities in all-cause mortality and their changes over time (Table 1). Both the populationand regression-based (i.e. SII) inequality measures indicate a reduction in absolute disparities between 2006–08 and 2017–19, reflecting the general trend towards improvement in mortality rates. However, in relative terms, the subnational disparities did not decrease but rather increased slightly. This is indicated by incremental increases in the weighted coefficient of variation and the RII for both males and females. As illustrated by the RII, relative mortality disparities between the top and the bottom deciles of the SDR distribution did not differ much between the sexes. For both periods, the mortality ratio

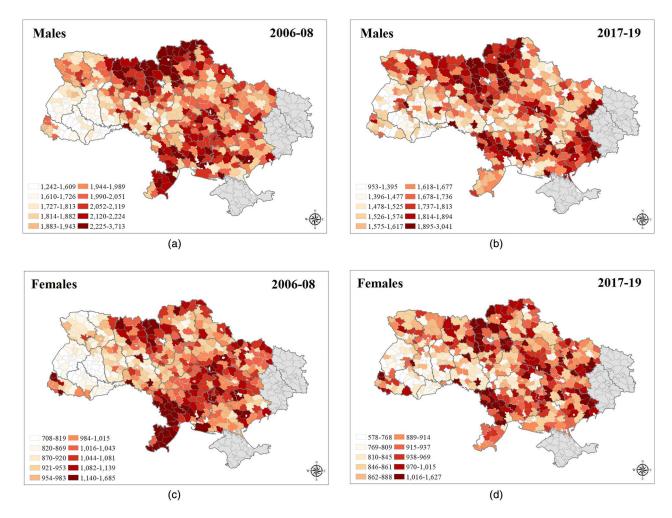


Figure 4 Spatial distribution of all-cause mortality for males and females in Ukraine: 2006–08 and 2017–19 Notes: Maps show standardized death rate (SDR) per 100,000. Donetsk, Luhansk, and AR Crimea (grey coloured) regions are excluded from the district-level analysis. Source: As for Figure 2.

Table 1 Selected indicators of mortality inequalities across Ukrainian districts and cities, 2006–08 and 2017–19

	Males		Females	
	2006–08	2017–19	2006–08	2017–19
Min-max range	2,471	2,088	977	1,078
Mean				
Weighted	1,780	1,494	928	820
Unweighted	1,942	1,645	985	893
Standard deviation				
Weighted	284	241	126	114
Unweighted	276	230	133	111
Coefficient of variation (per cent)				
Weighted	15.9	16.1	13.5	13.9
Unweighted	14.2	14.0	13.5	12.5
Slope index of inequality (SII)	920	790	410	370
1 2 7	[907, 933]	[778, 802]	[403, 418]	[363, 377]
Relative index of inequality (RII)	1.70	1.72	1.57	1.58
	[1.68, 1.72]	[1.71, 1.74]	[1.55, 1.58]	[1.57, 1.60]

Notes: Estimates computed on the basis of the SDR (per 100,000) and the mid-year size of the total population; 95 per cent confidence limits are shown in square brackets.

Source: Authors' calculations based on official data from State Statistics Service of Ukraine.

between the vanguard and laggard groups of Ukrainian districts and cities was about 1.7 for males and 1.6 for females.

Figure 5 provides a more nuanced look at the subnational mortality profile and its change between 2006–08 and 2017–19. Each 'step' on the 'inequality stairway' represents the group SDR (y-axis) as computed for each decile on the basis of the distribution of the SDRs observed in all districts and cities in a given period. Each SDR value corresponds to a share of the total population (x-axis). The position of the 2017-19 line below the 2006-08 line indicates a clear reduction in mortality across all deciles over time. For example, for males, the SDR of the laggard group (D10), which accounted for roughly 5 per cent of the total population in both periods, decreased from 2,402 to 2,092 per 100,000. The corresponding figures for females were 1,228 and 1,100 per 100,000. That the vanguard group (D1) accommodated the largest share of the total population reflects the fact that it consisted mostly of large cities, which have a longevity advantage over other areas. This can also be inferred from Figure 4, which shows that the capital, Kyiv, and other large cities fell in the lowest mortality category (small light spots on the maps). It is worth noting that the share of population in the 10 per cent of spatial units with lowest mortality (D1) has increased considerably, especially for females. In 2006–08, it comprised 30 and 22 per cent of the population of males and females, respectively, rising to 36 and 35 per cent in 2017–19. This implies that more districts and cities with large populations are now situated in the top decile.

The results of the decomposition analysis (Table 2) show that the mortality gap between the top and the bottom deciles has been driven by CVD, especially among females. The significance of CVD mortality increased over the period we analysed. In 2006–08, this cause of death explained more than half (54.4)

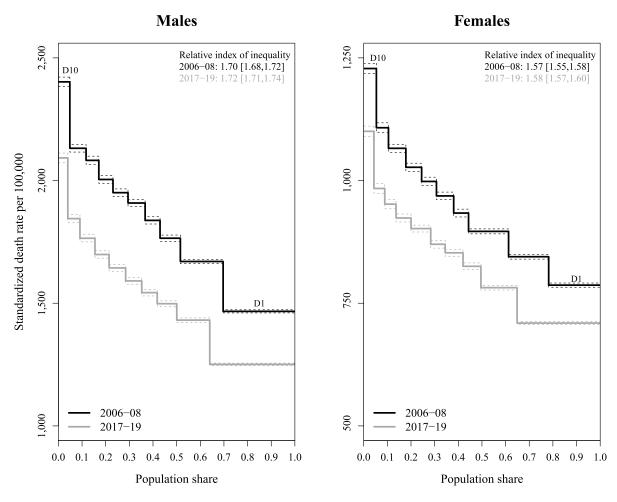


Figure 5 Inequality profile of regional mortality in Ukraine, 2006–08 and 2017–19 *Note*: Dashed lines are 95 per cent confidence intervals. D1 is the decile consisting of the vanguard districts and cities with the lowest mortality; D10 is the decile containing the laggard areas with the highest mortality. *Source*: As for Figure 2.

Table 2	Composition (percentages) of the cause- and age-specific contributions to the mortality gap between the top and
bottom o	deciles of Ukrainian districts and cities: males and females in 2006–08 and 2017–19

	Males		Females	
	2006–08	2017–19	2006–08	2017–19
Cause contributions				
All causes	100.0	100.0	100.0	100.0
Infectious diseases	3.5	1.6	3.7	1.3
Neoplasms	5.2	7.2	2.8	2.8
Cardiovascular diseases	54.4	71.7	70.1	84.2
Respiratory diseases	7.0	2.6	0.9	1.0
External causes	21.9	10.9	9.8	4.4
Other causes	8.0	6.0	12.7	6.3
Age contributions				
All ages	100.0	100.0	100.0	100.0
0–14	1.4	0.6	2.4	1.6
15–29	6.1	2.0	3.5	1.7
30–44	15.7	11.2	10.1	7.8
45–64	30.4	19.4	25.2	14.0
65+	46.4	66.8	58.8	74.9

Note: Mortality gap is the difference in SDR between the D1 (vanguard) and D10 (laggard) groups.

Source: As for Table 1.

per cent) of the mortality difference between the top and bottom 10 per cent among males and more than two-thirds (70.1 per cent) among females. By 2017-19, CVD's respective contributions had reached 71.7 and 84.2 per cent. At the same time, the role of external causes diminished drastically. In 2006-08, external causes explained one-fifth of the gap in mortality between the laggard and vanguard groups for males and one-tenth of the difference for females. In 2017-19, these proportions had declined to 10.9 and 4.4 per cent for males and females, respectively. Notable changes also occurred with respect to age-specific contributions. This primarily concerns the 65+ age group, whose contribution to the mortality gap increased markedly. In 2017-19, it contributed 67 and 75 per cent among males and females, respectively, compared with 46 and 59 per cent in 2006-08.

Hotspots and cold spots of cause-specific mortality

We now turn to the specific spatial distribution of mortality in Ukraine by specific causes of death. The raw mortality maps for males and females appear in the supplementary material (Figures A2 and A3). In what follows, we focus on maps of mortality hotspots and cold spots for selected causes of death (Figures 6 and 7). Traditionally, mortality from CVD has determined mortality trends in Ukraine and shaped the subnational mortality

differentials. CVD mortality hotspots for both males and females very closely mirror the spatial patterns of elevated all-cause mortality (Figure 4). However, there are important differences between the sexes in terms of the hotspot locations. For males, most of these hotspots were situated in the northern part of Ukraine, whereas for females the hotspots were scattered around various locations in the north, south, and east. Over the analysed period, the clusters of elevated CVD mortality became less homogenous and more scattered across the country (except western Ukraine). Compared with the hotspots, clustering of CVD cold spots became even less pronounced in 2017-19 as the large homogenous cluster in western Ukraine almost completely vanished. At the same time, a few clusters of low CVD mortality for males emerged in the south (Odesa and Kherson regions) and north-east (Sumy region), and low-mortality clusters expanded further in central Ukraine (Cherkasy and Kirovohrad regions).

Unlike in the case of CVD, a sharp contrast between the west and the rest of the country has persisted for mortality from external causes of death. Nevertheless, the large homogeneous cluster of low mortality (particularly visible for females) became smaller in 2017–19 due to changes in areas in the north-west (Volyn region), which were previously cold spots in 2006–08. Like for CVD mortality, clustering of hotspots of mortality from external causes became less pronounced over time. However, the geographical location of the main zones of elevated

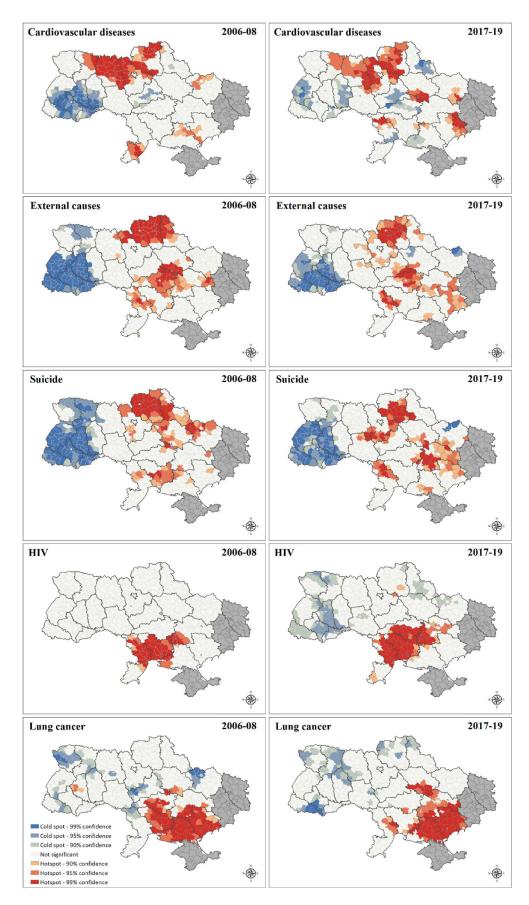


Figure 6 Hotspots and cold spots of mortality from selected causes: Ukraine, males, 2006–08 and 2017–19 *Source*: As for Figure 2.

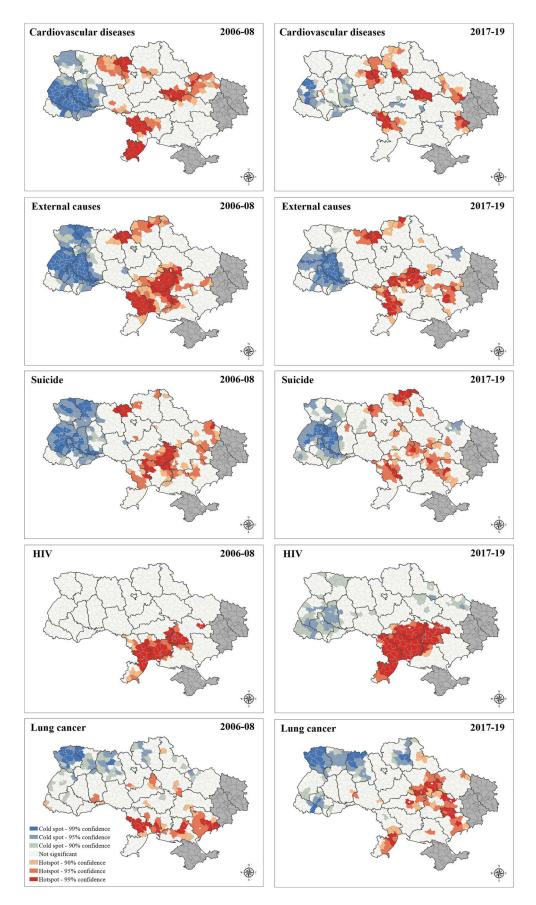


Figure 7 Hotspots and cold spots of mortality from selected causes: Ukraine, females, 2006–08 and 2017–19 Source: As for Figure 2.

mortality among males remained largely unchanged: the north (Chernihiv region and adjacent districts), the central part around Kirovohrad region, and some districts in eastern Ukraine. By contrast, for females, clustering of hotspots of mortality from external causes has been more pronounced in the south and the south-east (e.g. Mykolaiv and Odesa regions). The spatial patterns of suicide, which is the leading cause of violent mortality, largely mirror those of external causes.

Some communicable diseases, such as HIV, exhibit very strong hotspot clustering. Unlike for the other causes analysed, the clusters of elevated HIV mortality for males and females were alike in terms of their geographical location: southern and southeastern Ukraine. In 2017–19, these areas expanded towards the central and eastern regions. Another important observation concerns men's mortality from lung cancer, which exhibited strong clustering of hotspots in the southern and south-eastern parts of the country (Mykolaiv, Kherson, and Zaporizhzhya regions) in both 2006-08 and 2017-19. Interestingly, this was not so much the case for females, although their lung cancer mortality has also tended to be higher in the south and south-east and lower in the north and north-west. We also examined spatial patterns of mortality for other types of cancer and for all neoplasms combined. Unlike for lung cancer mortality, no indication of spatial clustering was found (see Figure A4, supplementary material, for all neoplasms combined).

Discussion

Main findings

In this study, we performed a comprehensive assessment of spatial patterns of cause-specific mortality in Ukraine, focusing on changes during the period between 2006 and 2019 before the outbreak of the Covid-19 pandemic. Previous studies had reported strong West-East and West-South-East mortality gradients for males and females (Libanova 2004; Murphy et al. 2013; Poniakina 2014). The deteriorating mortality situation in the north of Ukraine (regions bordering Belarus) had also been highlighted earlier as an important adverse development in the evolution of regional mortality in Ukraine (Poniakina 2014). Our results suggested that towards the end of our observation period in 2019, these long-lasting mortality gradients had been to some degree attenuated, due largely to the emergence of new zones of low mortality in central Ukraine. We also showed that the previously identified new zones of elevated mortality in northern Ukraine had not only persisted but also expanded towards the north-west of the country. The reasons for the poor performance of the north require further investigation. So far, we can offer only tentative explanations for the observed patterns.

The fact that the Ukrainian districts contaminated by the Chernobyl accident in 1986 are located in the north could be one explanation. On the one hand, there could be direct long-term health consequences for the population exposed to radiation. There is a significant positive association between residence in radiation-affected areas at the time of the accident and self-assessed poor health (Lehmann and Wadsworth 2011). The Ukrainian government set up a special welfare programme and monthly payments to residents of the contaminated territories to help people buy clean food and minimize the risk of consuming polluted foodstuffs, but these Chernobyl programmes proved unsustainable, poorly funded, and largely ineffective (Davies and Polese 2015). In these predominantly rural areas, people are used to consuming home-grown vegetables and foods foraged in the woods. Nevertheless, the evidence for adverse radiation-induced health effects in the contaminated areas is unclear except for a significant increase in thyroid cancer prevalence and a severe impact on psychological well-being (Likhtarov et al. 2006; Cardis and Hatch 2011; Kamiya et al. 2015; Danzer and Danzer 2016). Likewise, an assessment of causes of death related to the radiological impact of the Chernobyl accident in neighbouring Belarus revealed no clear picture (Grigoriev et al. 2013): although clusters of high mortality from thyroid cancer were detected in the most contaminated areas of Belarus, the observed patterns were not sufficient to conclude that Chernobyl had a significant direct impact on contemporary mortality.

On the other hand, the *indirect* effects of the Chernobyl accident could be of greater importance, as it has had profound negative ramifications for socioeconomic development in the affected regions, partly due to SES-selective outmigration. For instance, in the northern districts of Zhytomyr region, production in the agro-industrial sector dropped by 40 per cent between 1986 and 1996 (Kuzmin 2016). Some evidence suggests that those who lived in more contaminated areas displayed significantly lower levels of labour market performance (labour force participation, hours worked, and wages) 20 years on (Lehmann and Wadsworth 2011).

In addition to contamination as a *push* factor, geographical proximity to the capital, Kyiv, could be an

important pull factor for selective migration. A similar observation has been made in Belarus: the region surrounding the capital (Minsk oblast) revealed the lowest life expectancy in the country, lower even than in the less developed regions of eastern and south-eastern Belarus (Grigoriev et al. 2013). Similarly, selective migration has been proposed as a possible explanation for the extremely high premature mortality among males in the north-west European part of Russia (also known as the 'big triangle' because of its proximity to three major centres of labour migration: Moscow, St. Petersburg, and the Baltic States; Grigoriev et al. 2020).

Our assessment of regional mortality inequalities indicated a clear reduction in absolute terms but no major changes in relative terms over the analysed period. With respect to the latter, we found no pronounced differences between Ukrainian males and females as indicated by the RII. We showed that the mortality gap between the best- and worst-performing regions was driven largely by differences in the level of CVD mortality at older ages. In the most recent years, the role of CVD mortality has become particularly pronounced, especially among females. This suggests that there has been faster progress towards the reduction of CVD mortality in the vanguard group, which includes the capital and other large Ukrainian cities.

It has been suggested that the clear advantage of large metropolitan areas and cities might be explained by their higher share of highly educated, economically active people, who maintain healthier lifestyles and have better access to modern healthcare (Levchuk and Shevchuk 2021). Both factors are essential prerequisites for the cardiovascular revolution (Grigoriev et al. 2014), in which the vanguard group has been taking the lead. That Kyiv temporarily lost its vanguard position in the early 1990s due to a rapid decline in life expectancy fits with urban-rural patterns in other FSU countries. Initially, the magnitude of the life expectancy decline was greatest in large cities, where even food shortages emerged at times (Van Atta 1998), but large cities were also the first to recover (World Bank 2005).

Mortality from external causes has long been an important contributor to regional mortality differences, particularly among males (Libanova et al. 2007; Poniakina 2014; Ryngach 2021). However, as we showed, its relative importance has notably diminished. Nevertheless, unlike for most other causes of death, there is still a striking contrast between western Ukraine and the rest of the

country in mortality from external causes. Remarkably, the cold spot in western Ukraine follows historical borders and is centred on those parts of Ukraine that spent the shortest time under Russian or Soviet rule. The advantage of the west is also manifested in low mortality from suicide, which appears to be influenced by both individual-level characterand contextual (area-level) factors, as suggested by a recent analysis of longitudinal census-linked data for Lithuania (Jasilionis et al. 2020). Thus, the detected suicide mortality cold spot in western Ukraine can again be linked to historical political borders and can be attributed primarily to the cultural differences and high level of religiosity recorded in western regions, where religion is an important factor in cultural identity (Yelensky 2010; Ryngach 2017; Razumkov Centre 2019). Strong commitment to life-preserving religious or socio-cultural traditions and beliefs may have a positive impact on collective psychological well-being in these areas and reduce the suicide rate. There are a number of possible explanations for the significant clusters of high suicide rates in the north-east and south-east of the country: lower proportions of religious people, higher prevalence of alcohol- and drug-related mental disorders, and/ or problems related to unemployment and economic instability in urbanized areas. In addition, there is evidence that a massive population displacement since 2014 has resulted in a much higher prevalence of depressive and anxiety disorders among internally displaced persons (IDPs), with the majority of IDPs staying in eastern Ukraine (Kuznestsova et al. 2019; Roberts et al. 2019; Batyrgareieva et al. 2020). All these factors contribute to declining social cohesion, and lack of access to psychosocial support and treatment for mental disorders can also increase the risk of suicide. It is noteworthy that the small cluster of lower suicide rates in the areas close to the Russian border (in Kharkiv region) in 2017-19 is questionable and might result from suicide misclassification, with a high proportion of suicides hidden among EUI deaths (Levchuk and Shevchuk 2021).

The detected cluster of elevated HIV mortality in southern Ukraine and its further expansion towards the central part of the country is worrying. These observations are consistent with the regional data on HIV prevalence. Ukraine reports the second highest HIV prevalence in Europe, with an estimated 245,000 persons living with HIV, that is, 0.7 per cent of the adult population aged 15+ years (Antonenko and Martsynovska 2022). The country is disproportionally affected by HIV. The southern regions (Dnipropetrovsk, Mykolaiv, and Odesa) show the highest HIV prevalence, while western regions register much lower HIV rates. The HIV epidemic in the most affected regions is associated with a high prevalence of opioid-dependent individuals (Zaller et al. 2015) and a rapid spread of infectious diseases in the late 1990s and early 2000s among people who inject drugs and among their sexual partners (Levchuk 2011). Nevertheless, the spread of the HIV epidemic in these regions is not attributed only to traditional risk factors. A recent analysis of HIV mortality across Russian regions identified lack of knowledge about sexual transmission of the HIV in the general population as an important factor responsible for the expansion of the epidemic from marginalized communities to the general population (Nikoloski et al. 2023).

The large clusters of elevated mortality from lung cancer among males in south-eastern Ukraine, which have persisted over time, warrant further investigation. They could be explained by regional differences in past smoking behaviour or by greater exposure to industrial hazards and environmental problems due to a concentration of metallurgical and mining industries in this area (Zaporizhia and Dnipropetrovsk regions). Although it is hard to obtain clear evidence of the impact of environmental factors, Voitko et al. (2009) concluded that past smoking behaviour alone could not fully explain the spatial clustering of lung cancer mortality. They suggested that air pollution might also be responsible for the increased rates of lung cancer in south-eastern Ukraine in 1995–2004. Other studies have pointed to the disadvantageous position of the south in terms of smoking prevalence. In the 1990s and early 2000s, smoking rates among Ukrainian men were among the highest in Europe and reached over 50 per cent (Gilmore et al. 2001; Pomerleau et al. 2004). According to the Demographic and Health Survey conducted in Ukraine in 2007, men's smoking was more prevalent in the south (63 per cent) than in the north (44 per cent) and west (46 per cent) (UCSR 2008). Although the effective implementation of tobacco control and taxation policies since 2006 has resulted in a substantial decrease in the prevalence of tobacco use among males, smoking remains one of the major public health issues in Ukraine, and smoking-attributable mortality will continue to play an important role in shaping regional mortality differences in Ukraine (MHU 2017).

Study limitations

The study described in this paper had several limitations that must be acknowledged. The major concern

is the quality of post-censal population estimates, which are based on Ukraine's 2001 Population Census (the most recent available). Unfortunately, it is not possible to accurately quantify the impact of this unusually long post-censal period on either mortality indicators or regional mortality differentials. The error due to under-registration of migration events presumably accumulates over time, making the most recent mortality estimates less reliable. One indication of the problem with population estimates at district level is UkrStat's aggregation of official population counts into a large open age interval at ages 70+.

Before computing mortality rates, we investigated ways to split population estimates so that they matched the more detailed data on death counts. However, the obtained results turned out to be implausible. The process of splitting largely smoothed out the real and very substantial fluctuations in the population age structure (caused primarily by the cohorts born during and just after the Second World War). Furthermore, while applying the splitting to each population strata independently, we were unable to achieve internal consistency of the obtained population estimates. As a result, we had to compute mortality indicators based on data for ages 70+ combined, but the computed SDRs would have been more precise had we been able to obtain more detailed population data at older ages.

Our initial assessment of the raw mortality data indicated that the quality of death registration data varied across Ukrainian regions and over time. This is due mainly to varying proportions of illdefined deaths, which are relatively low in Ukraine compared with many other industrialized countries. In 2006-08, the average proportion of ill-defined causes in our data set covering 24 regions of Ukraine (items R00–R94, R96–R99 in ICD-10) was 2.7 per cent for males and 5.8 per cent for females. The corresponding figures in 2017-19 were 2.6 and 3.9 per cent, respectively. This makes Ukrainian mortality data less sensitive to the choice of redistribution method. We addressed the issue of ill-defined causes by redistributing those deaths across the other causes of deaths, except EUI deaths. We also treated the latter as ill-defined but within the external causes category. Because of the known issue of EUI misreporting in Ukraine and elsewhere (Rockett et al. 2011; Värnik et al. 2012), at the expense of violent deaths (suicides in particular), we redistributed EUI deaths proportionally between suicide and homicide.

We must mention that although our modifications were based on evidence and on established practice for dealing with ill-defined causes of death, the applied data adjustments were still arbitrary and by no means eliminated bias due to regional differences in coding practices. An apparent indication of such differences was the registration of CVD deaths. In our initial data assessment, we distinguished heart and cerebrovascular diseases within the CVD category. Unfortunately, it was not possible to analyse these groups separately because of the obvious interplay between them: regions with the highest mortality from heart diseases revealed the lowest mortality from cerebrovascular mortality and vice versa. The observed misreporting of CVD is a persistent phenomenon, as also noted in the study by Poniakina (2014).

The quality of population statistics could raise legitimate concerns as to whether the observed attenuation of regional mortality gradients in Ukraine was real or just an artefact of selective international or internal migration. The latter in particular intensified with the beginning of the war in Donbas in 2014. As we showed (Figures 2 and 3), the regions of Luhansk and Donetsk were distinguished by high mortality, particularly from external causes of death. Therefore, we would expect excluding the occupied territories from the analysis to have affected our conclusions. Indeed, the resettlement of evacuated persons from Donbas (the most densely populated area in the past) could have caused notable distortions because of the mixing of different survival regimes, health profiles, and self-preserving behaviour and habits of both local and displaced populations. According to official estimates (Table A2, supplementary material), the war that erupted in eastern Ukraine in 2014 resulted in forcible displacement of 1.5-1.7 million people. Unlike in 2022, when Ukrainians fled their homes throughout the country and went abroad in similar numbers, in 2014–19 the vast majority of IDPs from Donbas and Crimea were relocated within Ukraine. Out of the total 1.65 million officially registered IDPs in January 2017, the majority were located in the back-then non-occupied parts of Donetsk (34 per cent) and Luhansk regions (18 per cent), in Kharkiv region (12 per cent), and in Kyiv city (9.5 per cent). This implies that half of the displaced population remained in the Donetsk and Luhansk regions. The numbers of IDPs residing in western and central regions of Ukraine were very small. It is unlikely that displacement in 2014–19 had a substantial effect on either population or death counts in north-west Ukraine, given that IDPs comprised only 0.3–0.5 per cent of the total population in the Volyn and Rivne regions. IDPs comprised about 7 per cent of the total population in Kharkiv region and about 5 per cent in Zaporizhzhya and Kyiv city. Likewise, this would have had only a slight impact on mortality rates.

To verify that population dynamics were not affected by any unexpected changes, we computed the annual rate of population change for each spatial unit, sex, and broad age group over the analysed period. For the vast majority of districts, the annual change evolved smoothly (-0.86 per cent on average across all observations for both sexes and all ages combined). We found no systematic differences between sexes, nor between age groups. Furthermore, we identified only a few outliers reflecting possible defects in the vital registration system. However, these issues were too small to have had any notable impact on our results. By pooling the data by three-year periods, we largely eliminated these random fluctuations. The robustness of our mortality estimates was also confirmed by the stability of identified mortality clusters over the analysed period. This was very unlikely to have occurred in the presence of very significant distortions in the data collection system. Furthermore, the long time trends in cause-specific mortality (Figure 3) did not reveal any suspicious disruptions. This was especially obvious for mortality from neoplasms, where regional trends revealed remarkable regularities over the last three decades. Again, this would not have been the case in the presence of very serious issues with the denominator (population size) due to misreporting of migration events. Therefore, we believe that the identified data quality issues have not influenced our main conclusions.

Conclusion

This paper aimed to put Ukraine on the map in the field of contemporary spatial cause-specific mortality research. We were able to identify and discuss a number of relevant patterns, to deepen our understanding of Ukraine's achievements in mortality reduction and the remaining challenges. CVD continues to be the most significant cause of death and this is particularly the case in the mortality hotspots in northern and southern Ukraine. The northern Ukrainian CVD mortality hotspots include the areas heavily contaminated by the Chernobyl disaster. However, our data did not allow us to identify the degree to which this has been driven by contextual environmental effects or selective outmigration from contaminated areas and from Kyiv region to Kyiv city. We leave this to future research.

Overall, Ukraine still appears to be at an early stage of the cardiovascular revolution. Thus, public health investments in this area (including investments in the healthcare system but also in awareness campaigns about healthy lifestyles) still offer plenty of room for health improvements. For other important behaviour-related causes of death, such as lung cancer and HIV, we identified clear mortality hotspots. This is also helpful for public health policies aimed at tackling these issues, as they should focus especially on these hotspots.

It is beyond the scope of this paper to provide deep insights into the mechanisms that have caused the observed patterns. Furthermore, because of the ongoing war, it remains unclear whether the spatial mortality trends and patterns we have reported here will persist in future. Nevertheless, we believe that for years to come our work will serve as an important reference for future research. We have shown that northern Ukraine in particular has been lagging behind, while western Ukraine and large cities concentrated in the centre, east, and south represent mortality cold spots. Rather uncertain is the future of eastern Ukraine, particularly those territories in the Donbas that are most affected by the conflict. It is very likely that the war will substantially exacerbate the regional mortality disparities. Massive internal and international migration will eventually change the age-sex structure of the population in all Ukrainian regions. Likewise, the disruption of healthcare provision (e.g. limited access, inadequate vaccination, poor preventative measures, delays in intervention, and disruption of water and sanitation infrastructure), the economic crisis, and the violent environment will result in growing mortality from both non-communicable and communicable diseases (Leon et al. 2022). How exactly all these will affect regional mortality differences in Ukraine in future is a matter of great uncertainty.

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Disclosure statement

No potential conflict of interest was reported by the authors.

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References

0436-3565

Aburto, José M. and Alyson van Raalte. 2018. Lifespan dispersion in times of life expectancy fluctuation: The case of Central and Eastern Europe, *Demography* 55(6): 2071–2096. https://doi.org/10.1007/s13524-018-0729-9

Anderson, Georgina. 2020. PHEindicatormethods: Common Public Health Statistics and their Confidence Intervals. R package version 1.3.2. https:// CRAN.R-project.org/package=PHEindicatormethods

Andreev, Evgeny M., Vladimir M. Shkolnikov, and Alexander Z. Begun. 2002. Algorithm for decomposition of differences between aggregate demographic measures and its application to life expectancies, healthy life expectancies, parity-progression ratios and total fertility rates, *Demographic Research* 7(14): 499–522. https://doi.org/10.4054/DemRes.2002.7.14

Antonenko, Zhanna and Violetta Martsynovska, HIV infection in Ukraine. 2022. Information Bulletin 53. Public Health Center. Ministry of Health of Ukraine.

Applebaum, Anne. 2017. *Red Famine: Stalin's War on Ukraine*. London: Penguin Books.

Batyrgareieva, Vladyslava S., Alina V. Kalinina, and Andriy M. Babenko. 2020. Suicide as an indicator of the public mental health in Ukraine (including period of COVID-19), *Wiadomości Lekarskie* LXXIII(12/2): 2743–2751. https://doi.org/10.36740/WLek202012208

Bobak, Martin and Michael Marmot. 1996. East-West mortality divide and its potential explanations: Proposed

- research agenda, *BMJ* 312(7028): 421–425. https://doi. org/10.1136/bmj.312.7028.421
- Bobak, Martin, Hynek Pikhart, Clyde Hertzman, Richard Rose, and Michael Marmot. 1998. Socioeconomic factors, perceived control and self-reported health in Russia. A cross-sectional survey, *Social Science & Medicine* 47(2): 269–279. https://doi.org/10.1016/S0277-9536(98)00095-1
- Bobak, Martin, Hynek Pikhart, Clyde Hertzman, Richard Rose, and Michael Marmot. 2000. Socioeconomic factors, material inequalities, and perceived control in self-rated health: Cross-sectional data from seven post-communist countries, *Social Science & Medicine* 51(9): 1343–1350. https://doi.org/10.1016/S0277-9536 (00)00096-4
- Brainerd, Elizabeth. 1998. Market reform and mortality in transition economies, *World Development* 26(11): 2013–2027. https://doi.org/10.1016/S0305-750X(98)00096-5
- Brainerd, Elizabeth and David M. Cutler. 2005. Autopsy on an empire: Understanding mortality in Russia and the former Soviet Union, *Journal of Economic Perspectives* 19(1): 107–130. https://doi.org/10.1257/0895330053147921
- Cardis, Elizabeth and Maureen Hatch. 2011. The Chernobyl accident An epidemiological perspective, *Clinical Oncology* 23(4): 251–260. https://doi.org/10. 1016/j.clon.2011.01.510
- Cockerham, William C. 1997. The social determinants of the decline of life expectancy in Russia and Eastern Europe: A lifestyle explanation, *Journal of Health and Social Behavior* 38(2): 117–130. https://doi.org/10. 2307/2955420
- Cornia, Giovanni A. and Renato Paniccia. 2000. The transition mortality crisis: Evidence, interpretation, and policy responses, in G. A. Cornia and R. Paniccia (eds), *The Mortality Crisis in Transitional Economies*. Oxford: Oxford University Press, pp. 3–37.
- Danzer, Alexander and Natalia Danzer. 2016. The long-run consequences of Chernobyl: Evidence on subjective well-being, mental health and welfare, *Journal of Public Economics* 135: 47–60. https://doi.org/10.1016/j.jpubeco.2016.01.001
- Davies, Thom and Abele Polese. 2015. Informality and survival in Ukraine's nuclear landscape: Living with the risks of Chernobyl, *Journal of Eurasian Studies* 6(1): 34–45. https://doi.org/10.1016/j.euras.2014.09.002
- Gilmore, Anna, Martin McKee, Maria Telishevska, and Richard Rose. 2001. Epidemiology of smoking in Ukraine, 2000, *Preventive Medicine* 33(5): 453–461. https://doi.org/10.1006/pmed.2001.0915
- Gilmore, Anna, Joceline Pomerleau, Martin McKee, Richard Rose, Christian W. Haerpfer, David Rotman, and Sergej Tumanov. 2004. Prevalence of smoking in 8 countries of the former Soviet Union:

- Results from the Living Conditions, Lifestyles and Health Study, *American Journal of Public Health* 94 (12): 2177–2187. https://doi.org/10.2105/AJPH.94.12. 2177
- Grigoriev, Pavel, Gabriele Doblhammer-Reiter, and Vladimir M. Shkolnikov. 2013. Trends, patterns, and determinants of regional mortality in Belarus, 1990–2007, *Population Studies* 67(1): 61–81. https://doi.org/10.1080/00324728.2012.724696
- Grigoriev, Pavel, Domantas Jasilionis, Sebastian Klüsener, Sergey Timonin, Evgeny M. Andreev, France Meslé, and Jacques Vallin. 2020. Spatial patterns of male alcohol-related mortality in Belarus, Lithuania, Poland and Russia, *Drug and Alcohol Review* 39(7): 835–845. https://doi.org/10.1111/dar.13037
- Grigoriev, Pavel, Domantas Jasilionis, Vladimir M. Shkolnikov, France Meslé, and Jacques Vallin. 2016. Spatial variation of male alcohol-related mortality in Belarus and Lithuania, *The European Journal of Public Health* 26(1): 95–101. https://doi.org/10.1093/eurpub/ckv060
- Grigoriev, Pavel, France Meslé, Vladimir M. Shkolnikov, Evgeny M. Andreev, Agnieszka Fihel, Marketa Pechholdová, and Jacques Vallin. 2014. The recent mortality decline in Russia: Beginning of the cardiovascular revolution?, *Population and Development Review* 40 (1): 107–129. https://doi.org/10.1111/j.1728-4457.2014. 00652.x
- Grigoriev, Pavel, Vladimir M. Shkolnikov, Evgeny M. Andreev, Domantas Jasilionis, Dmitri Jdanov, France Meslé, and Jacques Vallin. 2010. Mortality in Belarus, Lithuania, and Russia: Divergence in recent trends and possible explanations, European Journal of Population / Revue Européenne de Démographie 26(3): 245–274. https://doi.org/10.1007/s10680-010-9210-1
- Human Mortality Database (HMD). 2022. Max Planck Institute for Demographic Research (Germany), University of California, Berkeley (USA), and French Institute for Demographic Studies (France). Available: www.mortality.org (accessed 29 September 2022).
- Jasilionis, Domantas. 2003. Sociodemographic determinants of urban-rural differences in mortality in Lithuania. Summary of doctoral dissertation, Kaunas University of Technology, Institute for Social Research, Kaunas.
- Jasilionis, Domantas, Pavel Grigoriev, Daumantas Stumbrys, and Vladislava Stankūnienė. 2020. Individual and contextual determinants of male suicide in the post-communist region: The case of Lithuania, *Population, Space and Place* 26(8): e2372. https://doi.org/10.1002/psp.2372
- Jasilionis, Domantas, France Meslé, Vladimir M. Shkolnikov, and Jacques Vallin. 2011. Recent life

- expectancy divergence in Baltic countries, European Journal of Population / Revue Européenne de Démographie 27(4): 403-431. https://doi.org/10.1007/ s10680-011-9243-0
- Kalediene, Ramune and Jadvyga Petrauskiene. 2000. Regional life expectancy patterns in Lithuania, The European Journal of Public Health 10(2): 101-104. https://doi.org/10.1093/eurpub/10.2.101
- Kalediene, Ramune and Jadvyga Petrauskiene. 2004. transition, Socio-economic inequality, mortality in Lithuania, Economics & Human Biology 2(1): 87–95. https://doi.org/10.1016/j.ehb. 2003.12.001
- Kamiya, Kenji, Kotaro Ozasa, Suminori Akiba, Ohstura Niwa, Kazunori Kodama, Noboru Takamura, Elena K. Zaharieva, et al. 2015. From Hiroshima and Nagasaki to Fukushima. Long-term effects of radiation exposure on health, The Lancet 386(9992): 469-478. https://doi.org/10.1016/S0140-6736(15)61167-9
- Krasovsky, Konstantin. 2012. Zmenshennya Smertnosti sered Naselennya Ukrainy u 2008-2010 Rokakh [Mortality decline in Ukraine in 2008-2010]. Tobacco Control and Public Health in Eastern Europe 2 (Supplement 1, 2nd Conference 'Economics, sociology, theory and practice of public health').
- Krumins, Juris, Domantas Jasilionis, Mall Leinsalu, and Vlada Stankuniene. 2009. Changes of geographical mortality differences in the three Baltic countries during the period of socio-economic transformation. Paper presented at the IUSSP 26th International Population Conference, Marrakech.
- Kuzmin, O. 2016. Knyga Pam'yati Ukrainy. Chornobylska Tragediya. Zhytomyrska oblast [The book of memory of Ukraine. The Chornobyl tragedy. Zhytomyr region]. Zhytomyr Oblast State Administration, Polissya.
- Kuznestsova, Irina, Oksana Mikheiva, Jon Catling, John Round, and Svitlana Babenko. 2019. The mental health of IDPs and the general population in Ukraine. University of Birmingham and Ukrainian Catholic University. www.idpukraine.com
- Lehmann, Hartmut and Jonathan Wadsworth. 2011. The impact of Chernobyl on health and labour market performance, Journal of Health Economics 30(5): 843-857. https://doi.org/10.1016/j.jhealeco.2011.07.011
- Leon, David A., Laurent Chenet, Vladimir M. Shkolnikov, Sergey Zakharov, Judith Shapiro, Galina Rakhmanova, Sergei Vassin, et al. 1997. Huge variation in Russian mortality rates 1984–1994: Artifact, alcohol, or what?, The Lancet 350(9075): 383-388. https://doi.org/10. 1016/S0140-6736(97)03360-6
- Leon, David A., Dmitri Jdanov, Christopher J. Gerry, Pavel Grigoriev, Domantas Jasilionis, Martin McKee, France Meslé, et al. 2022. The Russian invasion of Ukraine and its public health consequences, The

- Lancet Regional Health Europe 15: Article 100358. https://doi.org/10.1016/j.lanepe.2022.100358
- Levchuk, Nataliia. 2009. Alcohol and mortality in Ukraine. MPIDR Working Paper. WP 2009-017 June 2009.
- Levchuk, Nataliia. 2011. Asotsialni Yavyscha v Ukraini u Demographichnomu Vymiri [Demographic dimensions of deviant behaviours in Ukraine]. Kyiv, Ptoukha Institute of Demography and Social Studies.
- Levchuk, Nataliia M. and L. V. Luschik. 2019. Mizhregionalni Vidminnosti u Tryvalosti Zhvttva v Ukraini: Osnovni Tendentsii ta Zminy [Interregional differences in life expectancy within Ukraine: Main trends and changes], Демографія та соціальна економіка/Demography and Social Economics 1(35): 26-40. https://doi.org/10.15407/dse2019.01.026
- Levchuk, Nataliia M. and Pavlo E. Shevchuk. 2021. Struktura Smertnosti Naselennya za Prychynamy Smerti u Metropolisakh Ukrainy [Mortality by causes of death in metropolises of Ukraine], Демографія та економіка/Demography and Social соціальна Economy 4(46): 38–59. https://doi.org/10.15407/ dse2021.04.038
- Libanova, Ella M. (ed). 2004. Naselennya Ukrainy 2004. Regionalni Aspekty Demographichnoho Rozvytku [Population of Ukraine - 2004. Regional aspects of demographic trends]. Kyiv, Institute of Demography and Social Studies, State Statistics Service of Ukraine.
- Libanova, Ella M., Nataliia M. Levchuk, Nataliia O. Ryngach, Omelian P. Rudnytskyi, Svitlana A. Poniakina, and Pavlo E. Shevchuk. 2007. Smertnist Naselennya v Trudoaktyvnomy Vitsi [Mortality in working ages in Ukraine]. Kyiv, Institute of Demography and Social Studies.
- Likhtarov, I., L. Kovgan, S. Vavilov, M. Chepurny, E. Ron, J. Lubin, A. Bouville, et al. 2006. Post-Chornobyl thyroid cancers in Ukraine. Report 2: Risk analysis, Radiation Research 166(2): 375-386. https://doi.org/10. 1667/RR3593.1
- Menon, R., E. Ozaltin, S. Poniakina, B. Frogner, and I. liynyk. 2009. An Avoidable Tragedy: Combating Ukraine's Health Crisis. Lessons from Europe. Kyiv: World Bank, 64 p.
- Meslé, France and Jacques Vallin (eds). 2012. Mortality and Causes of Death in 20th-Century Ukraine. Demographic Research Monographs. London: Springer, 280 p.
- Ministry of Health of Ukraine (MHU), Kiev International Institute of Sociology, World Health Organization Regional Office for Europe, National Academy of Medical Sciences of Ukraine. US Centers for Diseases Control and Prevention. 2017. Global Adult Tobacco Survey. Ukraine 2017. Executive Summary.
- Murphy, Adrianna. Nataliia Levchuk. Andrew Stickley, Bayard Roberts, and Martin McKee. 2013. A

- country divided? Regional variation in mortality in Ukraine, International Journal of Public Health 58(6): 837-844. https://doi.org/10.1007/s00038-013-0457-2
- Nikoloski, Zlatko, Elizabeth King, and Elias Mossialos. 2023. HIV in the Russian Federation: Mortality, prevalence, risk factors, and current understanding of sexual transmission, AIDS 37(4): 637-645. https://doi.org/10. 1097/QAD.0000000000003441
- Omran, Abdel R. 1971. The epidemiologic transition: A theory of the epidemiology of population change, Milbank Memorial Fund Quarterly 49: 509-538.
- Ord, J. K. and Arthur Getis. 1995. Local spatial autocorrelation statistics: Distributional issues and an application, Geographical Analysis 27(4): 286-306. https:// doi.org/10.1111/j.1538-4632.1995.tb00912.x
- Penina, Olga. 2017. Alcohol-related causes of death and drinking patterns in Moldova as compared to Russia and Ukraine, European Journal of Population 33(5): 679-700. https://doi.org/10.1007/s10680-017-9450-4
- Penina, Olga. 2022a. Regional changes in life expectancy and causes of death in Moldova after independence. Economy and Sociology, (1): 72-86. https://doi.org/10. 36004/nier.es.2022.1-07.
- Penina, O. 2022b. Cardiovascular mortality in Central and Eastern Europe: Differences and similarities, Romanian Medical Journal 69(2): 50-56. https://doi. org/10.37897/RMJ.2022.2.2
- Pomerleau, Joceline, Anna Gilmore, Martin McKee, Richard Rose, and Christian W. Haerpfer. 2004. Determinants of smoking in eight countries of the former Soviet Union: Results from the Living Conditions, Lifestyles and Health Study, Addiction 99 (12): 1577–1585. https://doi.org/10.1111/j.1360-0443. 2004.00885.x
- Poniakina, Svitlana. 2014. Causes and evolution of mortality disparities across regions of Ukraine. Sociology. Université Panthéon-Sorbonne - Paris I, NNT: 2014PA010663.
- Razumkov Center. 2019. Derzhava I Tserkva v Ukraini-2019: Pidsumky Roku i Perspektyvy Rozvytku Vidnosyn (Inphormatsiini Materialy) [The state and the church in Ukraine-2019: Results of the year and prospects for developing relations (information materials)]. Kyiv.
- Roberts, B., N. Makhashvili, J. Javakhishvili, A. Karachevskyy, N. Kharchenko, M. Shpiker, and E. Richardson. 2019. Mental health care utilisation among internally displaced persons in Ukraine: Results from a nation-wide survey, Epidemiology and Psychiatric Sciences 28(1): 100-111. https://doi.org/10. 1017/S2045796017000385
- Rockett, I. R. H., N. D. Kapusta, and R. Bhandari. 2011. Suicide misclassification in an international context: Revisitation and update, Suicidology Online 2: 48-61.

- Rudnytskyi, Omelian, Nataliia Levchuk, Oleh Wolowyna, Pavlo Shevchuk, and Alla Kovbasiuk. Demography of a man-made human catastrophe: The case of massive famine in Ukraine 1932-1933, Canadian Studies in Population 42(1-2): 53–80. https:// doi.org/10.25336/P6FC7G
- Ryngach, Nataliia O. 2017. Vtraty Sprychyneni Smertnistyu v Rezultati Samogubstv v Ukraini [Losses caused by suicide mortality in Ukraine], Statistics of Ukraine 2(77): 70–78. https://doi.org/10. 31767/su.2(77).2017.02.10
- Ryngach, Nataliia O. 2021. The mortality due to external causes in Ukraine: Lives that could be saved, Statistics of Ukraine 89(3): 96-106. https://doi.org/10.31767/su.2-3(89-90)2020.02-03.11
- Shevchuk, Pavlo. 2007. Suchasni Zrushennya u Regionalnii Dyfferentsiatsiyi Smertnosti ta Tryvalosti Zhyttya v Ukraini [Current changes in mortality variation across regions in Ukraine], Демографія та соціальна економіка/Demography and Social Economics (2): 24–37.
- Shchur, Aleksey, Vladimir M. Shkolnikov, Sergev Timonin, Evgeny M. Andreev, and David Leon. 2021. Where do people live longer in Russia in the 21st century? Life expectancy across urban and rural areas, Population and Development Review 47(4): 1049–1074. https://doi.org/10.1111/padr.12437
- Shkolnikov, Vladimir M., Evgeny M. Andreev, David A. Leon, Martin McKee, France Meslé, and Jacques Vallin. 2004. Mortality reversal in Russia: The story so far, Hygiea Internationalis: An Interdisciplinary Journal for the History of Public Health 4(1): 29-80. https://doi.org/10.3384/hygiea.1403-8668.044129
- Shkolnikov, V. M., M. McKee, J. Vallin, E. Aksel, D. Leon, L. Chenet, and F. Meslé. 1999. Cancer mortality in Russia and Ukraine: Validity, competing risks and cohort effects, International Journal of Epidemiology 28(1): 19–29. https://doi.org/10.1093/ije/28.1.19
- Steshenko, V. S. 2001. Demographichna Kryza v Ukraini: Problemy Doslidzhennya, Vytoky, Skladovi, Napryamy Protydii [Demographic crisis in Ukraine. Challenges, causes, components, policy]. Institute of Economy, 456 p.
- Stickley, Andrew and Yury Razvodovsky. 2009. Alcohol poisoning in Belarus: A comparison of urban-rural trends, 1990-2005, Alcohol and Alcoholism 44(3): 326-331. https://doi.org/10.1093/alcalc/agn093
- Timonin, Sergey, Domantas Jasilionis, Vladimir M. Shkolnikov, and Evgeny Andreev. 2020. New perspective on geographical mortality divide in Russia: A district-level cross-sectional analysis, 2008-2012, Journal of Epidemiology and Community Health 74(2): 144-150. https://doi.org/10.1136/jech-2019-213239
- Trias-Llimós, Sergi and Fanny Janssen. 2018. Alcohol and gender gaps in life expectancy in eight Central and

- Eastern European countries, *European Journal of Public Health* 28(4): 687–692. https://doi.org/10.1093/eurpub/cky057
- Trias-Llimós, Sergi, Anton E. Kunst, Domantas Jasilionis, and Fanny Janssen. 2018. The contribution of alcohol to the East-West life expectancy gap in Europe from 1990 onward, *International Journal of Epidemiology* 47(3): 731–739. https://doi.org/10.1093/ije/dyx244
- Ukrainian Center for Social Reforms (UCSR), State Statistical Committee of Ukraine and Macro International. 2008. *Ukraine Demographic and Health Survey 2007: Key Findings*. Calverton, MD: UCSR and Macro International.
- UkrStat. 2023. State Statistics Service of Ukraine. Available: http://db.ukrcensus.gov.ua/MULT/Dialog/statfile_c.asp (accessed: 11 March 2023).
- Vallin, Jacques, Evgeny M. Andreev, France Meslé, and Vladimir M. Shkolnikov. 2005. Geographical diversity of cause-of-death patterns and trends in Russia, *Demographic Research* 12(13): 323–380. https://doi.org/10.4054/DemRes.2005.12.13
- Van Atta, D. 1998. Household budgets in Ukraine: A research report, *Post-Soviet Geography and Economics* 39(10): 606–616. https://doi.org/10.1080/10889388.1998.10641096
- Värnik, Peeter, Merike Sisask, Airi Värnik, Ella Arensman, Chantal Van Audenhove, Christina M. van der Feltz-Cornelis, and Ulrich Hegerl. 2012. Validity of suicide statistics in Europe in relation to undetermined deaths: Developing the 2-20 benchmark, *Injury Prevention* 18(5): 321–325. https://doi.org/10.1136/injuryprev-2011-040070

- Värnik, Peeter, Merike Sisask, Airi Värnik, Andriy Yur'Yev, Kairi Kõlves, Lauri Leppik, Aleksander Nemtsov, et al. 2010. Massive increase in injury deaths of undetermined intent in ex-USSR Baltic and Slavic countries: Hidden suicides?, *Scandinavian Journal of Public Health* 38(4): 395–403. https://doi.org/10.1177/1403494809354360
- Voitko, O. V., S. T. Omelchuk, and I. M. Ostapchuk. 2009. Vplyv Okremykh Antropogennykh Factoriv na Zakhvoryuvanist Naselennya na Rak Legeniv [The impact of some environmental factors on lung cancer incidence in Ukraine], Онкологія/Onkologiya 11(4): 257–262.
- Watkins, Susan C. 1991. From Provinces into Nations: Demographic Integration in Western Europe, 1870-1960. Princeton: Princeton University Press.
- World Bank. 2005. *Ukraine: Poverty Assessment, Poverty and Inequality in a Growing Economy*. Washington, DC. http://localhost:4000//entities/publication/3f30f4af-932e-5462-9d33-705eac62bc6d
- Yelensky, Viktor. 2010. Religiosity in Ukraine according to sociological surveys, *Religion, State and Society* 38 (3): 213–227. https://doi.org/10.1080/09637494.2010. 499280
- Zaller, Nickolas, Alonya Mazhnaya, Sarah Larney, Zahed Islam, Alyona Shost, Tatiana Prokhorova, Natasha Rybak, et al. 2015. Geographic variability in HIV and injection drug use in Ukraine: Implications forintegration and expansion of drug treatment and HIV care, *International Journal of Drug Policy* 26(1): 37–42. https://doi.org/10.1016/j. drugpo.2014.09.004