Labor Supply Effects of Survivor Insurance: Evidence From a Benefit Cut in the Netherlands *

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October 19th, 2021

PRELIMINARY VERSION, PLEASE DO NOT CITE

Abstract

This paper investigates the effects of survivors' benefits (SB) on labor supply responses. Building on rich administrative data on the universe of Dutch residents, we use the 1996 Dutch reform that considerably tightened eligibility rules to causally identify the labor supply effect of SB. We use a regression discontinuity approach, leveraging the cohort-based implementation of the reform. We show that, following the tightening of SB eligibility, individual income and labor force participation after spousal death increase significantly (+23% and 16% respectively). We further decompose those effects and show that the widows who (re)entered the labor market due to the reform mainly did so in the care sector, and that already working widows increased their number of working hours by 8%. We also find evidence of substitution of widows toward disability insurance as a result of the reform. Finally, our heterogeneity results suggest that the magnitude of the response to the reform depends on widows' ability to self-insure against the risk of spousal death.

^{*}We are grateful to Jonneke Bolhaar, Carole Bonnet, Itzik Fadlon, Marion Goussé, Arthur van Soest, Marianne Tenand and Maxime Tô, as well as the participants of the Ined Séminaire café, the CPB internal seminar, the Chaire Travail PSE internal seminar and the EALE 2021 conference. All remaining errors are our own.

1 Introduction

The death of a spouse is not only a devastating life event, it is also a source of major financial risk. Subsequently, through multiple channels, it may affect the labor supply of the survivor. First, the loss itself may affect the well-being of the bereaved partner (Siflinger 2017), which, in turn, may affect the ability to work. Second, spousal death can modify individual preferences – e.g disutility from work – because of the loss of shared leisure with the deceased (Goux et al. 2014). Last but not least, a spouse's death will change the household's standard of living: some economies of scale are lost, as well as the personal income of the deceased spouse, triggering labor supply responses. These financial risks can be partially offset by public or private life insurance. In this paper, we focus on the latter financial determinant of the labor supply response to spousal death and study the role of publicly provided survivors benefits.

Survivors insurance against spousal death can be provided through a first-pillar public insurance system, or through second-pillar occupational based pension. Individuals can also self-insure through private contracts. Public survivors insurance systems have been widely questioned in recent years, on different grounds. Survivors insurance schemes represent a large public expenditure that is considered as (i) inadequate, as it has not evolved with conjugal behaviors (more separations), (ii) unfair, as it generates transfers from singles to couples that may not seem justified, (iii) inefficient, as these schemes can generate large disincentives to female employment. As a result, several countries have decided to lower the generosity or even eliminate these public schemes (OECD 2018).

In this paper, we analyze the effect of the elimination of the Dutch first pillar survivors insurance on labor supply of survivors. Before the reform, the Netherlands were characterized by a generous public SB scheme and low female employment rate. The reform considerably tightened eligibility rules to SB for individuals born after January 1st, 1950. The reform provides a clean quasi-experimental setting as it induced a large and discontinuous drop in SB received over the lifetime. Using a regression discontinuity (RD) approach and high quality administrative data on the full universe of the Dutch widows, we estimate the causal effect of survivors benefits on female income and labor force participation. We then decompose the extensive margin by type of industry, and the intensive margin response between hours worked and wage rate. To assess the overall effect of the reform on public spending, we also explore substitution effects by analyzing the take-up of other social security programs as a response to the reform. Finally, in order to investigate the insurance value of survival benefits, we examine whether the responses to the reforms are heterogeneous across different groups with regards to self-insurance ability.

We find that the tightening of SB eligibility leads to an important increase in personal

income (+23%) and labor force participation (+16%) three years after spousal death. The implied income elasticity to labor force participation (-0.4) is large and roughly in line with recent findings in the literature (Giupponi 2019, Fadlon & Nielsen 2020). The extensive margin response of non-working widows is largely driven by the care sector. The probability to work increases by 6 percentage points (pp) overall, with the increase in the probability to work in the care sector specifically contributing by more than half of the effect (3.5 pp). We then analyze the intensive margin in two ways, by conditioning on working before and/or after spousal death. We first find that widows who worked during the year preceding spouse's death, increased by 16.10% their number of worked hours because of the reform. Among widows who also keep on working after their spouse's death, the reform increased the number of worked hours by 8%. We find no effect on wage rate. Assessing insurance programs' substitutions generated by the reform, we find evidence of an increase in the take-up of disability insurance (+1.5 pp). We also find direct substitution towards welfare benefits, for widows without any source of income after loosing survival benefits (+6 pp). Finally, we show that the magnitude of the response to the reform depends on individuals' ability to self insure against the risk of spousal (income) loss. We find that individuals without a job before their spouse died react much more than the others, as well as individuals whose share in the household total income was the lowest. However, we surprisingly find no evidence of a differentiated reaction to the reform by level of liquid wealth.

In general, our paper relates to the literature studying the labor supply effect of spousal death. While the widespread risk of poverty affecting elder women after widowhood has been largely described in the literature, the literature on its economic consequences on working-aged women is relatively scarce. Fadlon & Nielsen (2020) show that a spouse's death induces an increase in labor supply because of the loss of the deceased spouse's income, while van der Vaart et al. (2020) show a drop in standard livings for working age women, which is due to a decrease in labor supply. However, those papers do not directly assess the role of survivor insurance in labor supply response to spousal death.

More specifically, our paper is related to the literature studying the labor supply effect of

¹Note that the question of the effect of economic consequences of widow(er)hood is conceptually and empirically close to the effect of divorce or separation. Our paper also indirectly relates to this rich literature. It has extensively been shown in different countries and various contexts that women encounters a strong decrease in their living standards following divorce while for men the evidence is mixed (for a literature review, see Mortelmans 2020). Consequently, there is empirical evidence of an increase of female labor supply following a divorce (Bargain et al. 2012, Bonnet et al. 2021). It also also been shown evidence of anticipatory behavior, with female labor supply increases prior to the divorce (Poortman 2005). In other words, women may take up a job as a form of insurance in case of divorce, or in anticipation of divorce.

²More precisely, and consistent with a self-insurance reaction to compensate the income shock, Fadlon & Nielsen (2020) find that individuals with low income or low income share increase their labor supply while others decrease it. van der Vaart et al. (2020) compare the effect of a spouse's death on labor supply for widows whose spouse's death happened before a means test was introduced and for those whose spouse's death happened after. They find a decrease in labor supply for the latter group that they explain by the introduction of the means-test.

survival insurance schemes. Despite the importance of survivors benefits, both in terms of public expenditure and their role of consumption smoothing in the difficult time of spousal death, the literature on the topic is relatively scarce. This question has been investigated in theoretical papers, using dynamic structural life-cycle models to help understanding the role of marriagebased social insurance on household's labor supply decision. Kaygusuz (2015), Fadlon & Nielsen (2019), Nishiyama (2019), Groneck & Wallenius (2021), Borella et al. (2019) find that removing spousal and survivors benefits would increase female labor participation. These theoretical predictions have been empirically verified in recent papers that use natural experiments to study the causal effect of survivors insurance over survivors' labor supply, and find important responses. Giupponi (2019) shows that the lower generosity in Italian SB translated into an increase in labor supply. Böheim & Topf (2021) show similar results for widowers in the Austrian context but find no evidence of a significant response for those who were already working before their spouse's death. Finally, by Fadlon et al. (2019), exploits the age discontinuity in SB eligibility in the US. They show that eligibility to SB induces a decrease in labor supply. They find a considerable gradient in responses according to income level. They highlight that liquidity constraints, rather that myopia, explains widows' response: labor supply declines are attributable to lower liquidity households who exhibit large effects, whereas the highest-liquidity households are able to fully smooth their labor supply behavior.

Even if we do not aim at providing a welfare analysis of the reform, the large labor supply responses to survivors insurance we find are informative about the insurance value of the scheme, and the potential moral hazard issue it can entail. Our analysis indeed provides information about the trade-off between consumption smoothing and moral hazard in the optimal design of public insurance (Baily 1978, Chetty 2006, Landais 2015). We also study potential spillovers between different types of insurance: reduction in generosity of one type of insurance can induce take-up of alternative insurance schemes. Such substitution effects can limit the labor supply effect of a reform, and generate negative externalities of the reform on public spending. Giupponi (2019) gives evidence of such program substitution for survivors insurance. This is also closely related to the large literature analyzing substitution effects toward unemployment or disability programs, in the context of pension reforms, or disability insurance reforms (Duggan et al. 2007, Karlström et al. 2008, Li & Maestas 2008, Coe & Haverstick 2010, Staubli 2011, Staubli & Zweimüller 2013, Borghans et al. 2014, Atalay & Barrett 2015, Inderbitzin et al. 2016, Rabaté & Rochut 2020).

We make the following contributions to the literature. First of all, we provide a new and clean evaluation in the scarce but booming literature studying the causal effect of survivors benefits on survivors' labor supply. Our empirical strategy combines a sharp and large reform of survivors benefits with rich administrative data, which makes it possible to isolate the effect of survivors benefits from confounding factors and reforms. In line findings of recent studies, we find large increases in the surviving spouse's labor supply as a response to a benefits cut. Second, extend on the existing literature in four ways. First, we are able to provide a precise decomposition of widows' labor supply response to the reform. This allows us to disentangle the different response's margins – income, participation, hours worked, wage rate — and to provide a complete assessment of the reforms' effect. We fill a gap in the literature displaying the precise intensive margin component of the response. Indeed, we decompose the intensive margin response between the wage rate and hours worked responses to the reform, which was done using proxies in previous papers. Second, we further decompose the extensive margin, by providing a split of the response by sector of activity, which has never been explored in the literature. We find that the care sector mainly absorbs the flow of extra widowed workers. Third, we investigate substitution with other programs and find evidence of an increase in the take-up of other insurance schemes. This is consistent with Giupponi (2019), but not often observed in the literature for other insurance schemes. Fourth and lastly, we carry out heterogeneity analyses to investigate the hypothesis that the people most affected by the reforms are those who had a low level of self-insurance, including an analysis of the labor supply response by wealth level. This latter component – for which we surprisingly find no heterogeneous effects – was not included in previous studies.

The rest of the paper is organized as follows. Section 2 describes the institutional background, section 3 describes the data and the empirical strategy, we describe the results in sections 4 and 5 and section 6 concludes.

2 Institutional context

Insurance against spousal death can be provided through three main sources in the Netherlands. A public first pillar insurance provides a basic pension of which amount and eligibility do not depend on labor market history of either of the spouses. A second pillar is the occupational based pension plan. It depends on the deceased spouse's work history, and rules for coverage and replacement rates vary from one pension fund to the other. Lastly, individuals can self-insure through private contracts (e.g life insurance).

In our analyses, we focus on the first pillar survivors insurance. The rest of this section presents its rules and their evolution. We present a somehow simplified description of the institutional context, concentrating on the elements essential to the understanding of our empirical

strategy. A more detailed presentation is given in Appendix A.

The public SB system in the Netherlands. Over the period covered by our data (1999-2019), the rules of the first pillar of survivors benefits (SB) were defined by the reform act which was implemented in 1996 and gave its name to the scheme (*Algemene nabestaandenwet*, Anw).³

In terms of eligibility, married couples, registered partners and cohabitants were eligible to survivors' benefits if the survivors met any of the following conditions: (i) caring for a child aged less than 18 or (ii) suffer from inability to work (at least 45% disabled). While eligible, survivors receive benefits from spousal death up to the moment their younger child gets 18 years old or they reach the state pension age (equals to 65 for individuals born before 1948 and then progressively increasing). From that latter age on, the Anw pension is replaced by the public pension system (AOW, Algemene Ouderdomswet). Benefits are also cut if the the survivor forms a new household.

In terms of amount, the survivor gets a flat benefit equals to 70% of a gross minimum wage, plus 20% of a gross minimum wage in the presence of a minor child (half-orphan's benefits). The benefits are means tested: if the survivor has income, it is partly or fully deducted from the Anw benefits, depending on the type of income and the type of benefits. The part of SB related to the care of a minor child is not means tested, the mean test only applies to the basic part (70% of the minimum wage). Unemployment, sickness and disability benefits are fully deducted from Anw benefits. Survivors' benefits from other schemes (second and third pillar) are not deducted. Finally and most importantly, labor income is partially deducted from Anw benefits. The benefits are phased-out from labor income above 50% of fulltime work at minimum wage, with a rate of 66%. Individuals with income over 155% of a gross minimum wage then do not receive any SB.

Change in eligibility criteria and benefits cut. The 1996 reform did not implement Anw immediately. A transition period exempted individuals (i) whose spouse's death occurred before July 1999 and (ii) who were born before 1st, January 1950, who remained eligible to survivors benefits (they however became means-tested). As we observe labor market outcome for the full population from 1999, we do not exploit the 1996 discontinuity in the rest of the paper. We focus on the date of birth discontinuity in eligibility introduced by the reform. Table 1 summarizes

³It replaced the General Widow and Orphans Benefits Act (AWW, Algemene Weduwen- en Wezenwet). This former scheme was tied to the marriage contract. A widow(er) was eligible to survivors' benefits if (i) he or she was 40 years old or more, (ii) had at least a child under the age of 18 or (iii) suffered from inability to work. The survivor got 100% of a gross minimum wage for those caring for a child under the age of 18 or 70% a of gross minimum wage otherwise and there was no means test.

⁴As of 1st, July 2021, the yearly gross minimum wage in the Netherlands is equal to 20,412 euros (23,876 dollars).

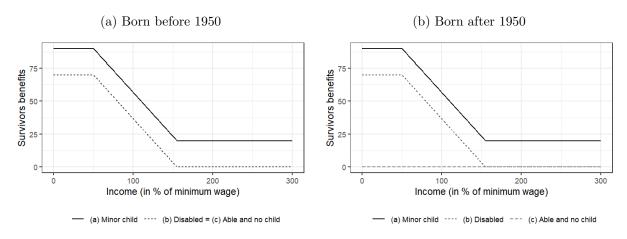
our main source of variation: individuals born after 1950 are eligible to SB only if they care for a minor child or are disabled. Figure 1 illustrates the effect of the reform in terms of benefits, according to income level. We observe that the means-tested schedule for SB disappears for able individuals who do not care for a child, while being unaffected for the others.⁵

Table 1: Eligibility to SB

	Born before 1950	Born after 1950
Cares for a child	✓	✓
Is disabled	\checkmark	\checkmark
Does not care for a child and not disabled	\checkmark	X

Source: Legislation

Figure 1: SB amount in % of minimum wage according to date of birth



Source: Legislation.

Confounding reforms. There are three confounding reforms potentially interacting with our reform of interest, since they (i) impact the same group of cohorts and (ii) can have an effect on employment outcomes of survivors. We hereby present them and discuss the implication they have on our empirical strategy.

The first one is the partner pension reform. It is a pension supplement for the older partner who has reached the AOW-age, provided that the younger one had an income below a certain amount. This supplement was removed from April, 1st 2015, the older partner would not receive the supplement any more. Individuals born before January, 1st 1950 were thus exempted. Nagore-Garcia & van Soest (forthcoming) find only limited effect of the reform for the older spouse, for which the 1950 discontinuity applies. Based on this result, and on the fact that the surviving spouse is less likely to be the older spouse, we consider the interaction with this reform

⁵Properly speaking, individuals caring for a minor child may be affected by the reform as benefits end as soon as their youngest child gets 18 years old vs. at AOW-age before the reform.

to be of second order of importance.

The second confounding reform relates to the occupational pension reform, which was implemented in 2006 and largely reduced the generosity of early retirement schemes for individuals born on January, 1st 1950 and after. It then translated into a large negative shock on pension wealth for individuals. As a consequence, it modifies resources composition and labor supply between 60 and pension age. Atav et al. (2021) show this reform translates into an increase in employment rates for the 60-65 age. This important reform affects the cohorts with the same discontinuity as the one of our interest. Nevertheless, there is no reason why the effects of this reform should occur at the time of the spouse's death, which implies that we can account for those interactions in our empirical strategy, when estimating the effect of the reform in section 4.

Third and lastly, the statutory retirement age is progressively increased from 65 to 67 in 2023. In particular, it increased from 65 and 2 months to 65 and 3 months for individuals born after November 1949, which is close to the 1950 cutoff. As the first pillar SB are perceived until the statutory retirement age, this could interact with our reform of interest. Yet, we argue that this effect is likely to be small, based on two reasons. First, this one-month increase represents only a small change in lifetime time earnings compared to the effect of the SB reform. Second, we can test that an increase in the statutory retirement age itself, without any change in the SB, does not have any significant effect on the income trajectories after spouse's death (see section 4.3).

3 Data and empirical strategy

3.1 Data presentation

Data sources. The data sources we use in this paper are administrative data covering the full Dutch population. The register data are maintained by Statistics Netherlands (CBS) and cover all residents living in the Netherlands. We have information on complete individual trajectories, and retrospective data on household histories. Each record contains a unique personal identifier that let us merge datasets and get information on individuals, their civil-status and household histories (from 1995 onward), their labor, welfare or pension income from tax data (from 1999 onward), their wages, hours worked and activity sector from employers-employees data (from 2006 onward), their wealth (from 2006 onward), their partner's and child's characteristics and the survivors benefits they possibly receive (from 2005 onward). More details can be found on which datasets we have mobilized and how we have combined them to define our population of

interest for the analyses in Appendix B.

Sample selection. In the rest of analysis, we focus on widows because survivors are mostly women, due to their higher life expectancy and the age difference between spouses. We exploit a discontinuity according to date of birth: January, 1st 1950. We thus focus on individuals born between 1946 and 1953. In order to observe the population of interest on a six-years period around death (three years before and three years after), we define our scope as widows whose spouse died from January 2003 and before they reached age 62 (three years before the state pension age).

As we want to focus on widows that are affected by the reform, we remove from our estimation sample widows who care for a child who will be age 18 before they reach AOW-age, as they were not affected by the eligibility restriction. Disabled widows were also unaffected by the reform, but we cannot detect them in the data at our disposal.⁶ As a result they are kept in our sample of analysis. In the following, 'treated individuals' as well as 'treated cohorts' will refer to individuals belonging to cohorts born after January, 1st 1950, even though the disabled are not treated.

Table 2 presents descriptive statistics of the data and variables we use in the paper. Age at spousal death, as well as average labor supply outcomes over the pre-death period show monotonous trends, but no jump, over the cohorts of birth. This is consistent with a relatively stable age difference between spouses and male life expectancy, and with the increasing women's participation in the labor market over the period, respectively. The last control cohort (widows born in 1949) was aged 57 at the time of their spouse's death. Among them, 44% worked during the year preceding death. Their average income over the three-years period before death amounted to 740 monthly euros, which corresponds to 31% of total household income. Overall, 39% never worked on this three-years period, 25% had an average income that is lower than SB means-test threshold in case of a spouse's death, 25% would be partially means-tested and 11% would a priori be fully means-tested.

3.2 Empirical strategy

The 1996 reform introduced a discontinuity in SB eligibility. From 1996, survivors are eligible to SB only if they were born before January, 1st 1950 or if they care for a child or are disabled. We exploit this discontinuity in the date of birth to identify the causal impact of SB elimination on labor supply. We use a regression discontinuity framework (Lee & Lemieux 2010), in which

⁶We could identify the disabled as individuals who benefit from disability benefits. However, disabled individuals are eligible to disability benefits from 35% incapacity while eligibility to SB is conditional on 45% incapacity. We thus are not able to identify the group of individuals who are eligible to SB with a disability criteria.

Table 2: Descriptive statistics per cohort of birth

	1946	1947	1948	1949	1950	1951	1952	1953
Nb of individuals	4,289	4,469	4,577	4,579	4,771	4,803	5,310	5,542
Age	58.3	57.9	57.5	57.0	56.6	56.2	55.8	55.5
Working status (in %)	34.6	38.8	41.0	43.9	47.1	51.3	51.7	55.0
Labor income (in euros)	521	593	676	738	808	926	972	1,071
Income share (in $\%$)	30	22	30	31	31	27	33	33
Total wealth (in k euros)	233	241	229	248	227	231	211	211
Liquid wealth (in k euros)	292	317	302	323	299	308	296	298
Labor income (x) category	(in $\%$):							
never worked	50	46	42	39	36	32	30	26
$x \le 0.5 \text{MW}$	22	22	23	25	25	25	26	26
$0.5 < x \le 1.55$	19	23	23	25	26	28	29	30
x > 1.55 MW	9	9	11	11	12	15	15	17

NOTE: Age refers to age at spouse's death. Working status refers to the proportion of individuals who have had at least a period of work during the year preceding death. Labor income is expressed in monthly euros and wealth is defined on a yearly basis. Labor income category refers to average income level on the 3 years pre-death period, expressed in number of minimum wages (MW). Labor income category refers o the three-year period preceding spouse's death. In particular, the proportion of widows who never worked on the 3-years pre-death period is mechanically lower that the proportion of those who never worked during the year preceding death (working status). Monetary values are expressed in 2018 euros.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

the assignment variable is the survivor's date of birth. Individuals born before January, 1st 1950 compose the control group while the others are treated.

We estimate the following equation:

$$Y_i = \alpha + \beta . m(dob_i - 1950) + \delta . \mathbf{1}_{dob > 1950} * m(dob_i - 1950) + \gamma . X_i + \epsilon_i$$
 (1)

where Y_i is the independent variable (labor income and labor force participation), dob - 1950 is cohort variable, equal to the difference between woman i's date of birth and January, 1st 1950 (in quarters in our main specification), m() is a polynomial function, X_i is a vector of age controls and ϵ_i is a random noise. δ is our parameter of interest and captures the SB reform on labor supply. We estimate equation (1) using OLS, separately for each quarter t between -3 and 3 years relative to spousal death.

The main identification assumptions in a regression discontinuity (RD) are that individuals cannot manipulate their treatment status, are similar on both sides of the discontinuity and that there are no other elements than the reform of interest that are changing at the discontinuity and can impact the outcomes of interest. Our running variable – date of birth of the individuals

– is by essence not manipulable. We nevertheless plot the probability density function of benefit recipients by quarter of birth in Appendix Figure C.1. We verify that there is no visible discontinuity in the density around the threshold. Moreover, the McCrary test statistics reported on the graph do reject the null hypothesis of discontinuity at the threshold. As already said, the RD identifying assumption implies that individuals around the cutoff are comparable in their observable and unobservable characteristics. We therefore perform a covariate balancing test using parametric and non-parametric RD specifications. As reported in Appendix Table C.1, covariates are balanced under both the linear and the quadratic parametric specifications, and the local linear regression specification.

Our identification strategy relies on the assumption that, absent the reform, spousal death would have had the same effect on labor supply for survivors born before and after 1950. In the next section, we provide two important results regarding the credibility of this assumption. First, we display pre-trends and show that there is no significantly different from zero difference between the cohorts before spousal death with regards to labor supply. Second, we carry out placebo analyses and show that there is no significant difference response to counterfactual reforms that would have happened for 1949 or 1951 cohorts, respectively.

As discussed in section 2, the main threat to our identification strategy are the potential interactions with contemporaneous pension reforms whose implementations were also (i) cohort-based and (ii) at the vicinity of the 1950 cut-off. We discuss in details in the next section how we deal with this question. Generally speaking, a large part of the threat is alleviated by the fact that we can observe the dynamic of the effect of the reform before and after spousal death and that there is no clear reason why the effect of the pension reforms would be correlated with the timing of spousal death. A difference in labor supply outcomes observed at the date of birth cutoff and that kicks in after the death of the spouse is then very likely to be driven by the change in the eligibility to survivors benefits we are studying.

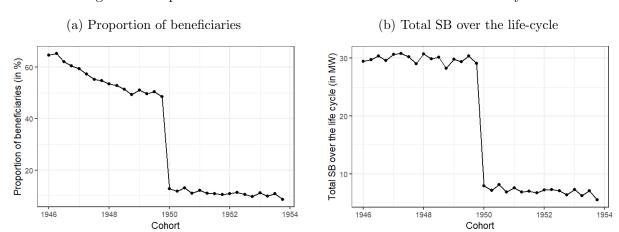
4 Main results

4.1 Graphical evidence

We first present graphical evidence of the effect of the change in survivors benefits' eligibility. We start with a description of the effect of the reform on survivors benefits, to verify and assess the bite and magnitude of the reform. Figure 2 presents two illustrations of the effect of the reform in terms of survivors insurance. Figure 2a shows the proportion of SB beneficiaries among widows per cohort. We verify there is a large drop in this proportion from 1950 cohort of birth. Among

widows born before 1950, despite a decreasing trend, a large part of the population receive SB. 65% of widows born in the first quarter of 1946 benefit from SB so as 49% of those born in the last quarter of 1949. This proportion is much lower for widows who were treated by the SB reform. Indeed, for those born in the first quarter of 1950, only 13% receive SB benefits. This proportion lowers to 9% for widows born in the last quarter of 1953. This drop in eligibility translates into large changes in the total amount of SB received over the life-cycle, as depicted in Figure 2b. Even though the impact of the reform is limited by the fact that the SB pension is only received between the spousal death and retirement age, we observe a clear and large discontinuity in total SB received at the cutoff. The average total SB amount over the life-cycle is approximately equal to 30 minimum wages (corresponding to 50 thousands of 2018 euros) for widows born before 1950. On average, this corresponds to a six-years widowhood duration. For individuals born after 1950, this amount dropped to 7 minimum wages on average. The magnitude of the drop lifetime income due to the reform – almost 40k euros – is then important, and likely to trigger large labor supply responses.

Figure 2: Proportion of SB beneficiaries and total SB over the life-cycle



NOTE: MW stands for minimum wage. To compute total SB over the life-cycle, some SB amounts were backcasted from the earliest observation (as a proportion of the minimum wage) between the year after the widowhood date and the first year for which an amount is observed.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

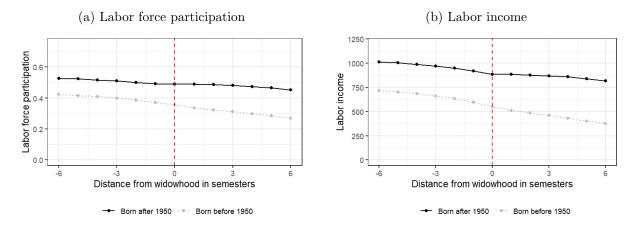
We then present graphical evidence of the effect of spousal death on labor supply, according to individuals' date of birth (before and after 1950). As a first glance at the labor supply response to the reform, Figure 3 presents widows' labor force participation and monthly income level according to distance to spouse's death for treated and non treated cohorts. For non treated cohorts, we observe a continuous decline in labor force participation and in labor income. In

⁷The remaining beneficiaries in the post-reform group is likely to be driven by disabled widows, since they are not affected by the reform but cannot be detected in our data (see section 3.1).

particular, there is no discontinuity at spouse's death. Conversely, for individuals born after 1950, we observe a stabilization of labor supply following the spouse's death. Even if the pattern we observe are partly tampered by the different age composition of the groups, it does suggest that labor supply increased as a response to the cut in public SB.

Indeed, as shown in Appendix Figure C.2, SB income dropped for individuals born after 1950 compared to those born before. The figure presents widows' monthly income level according to distance to spouse's death for different types of income, for individuals born before and after the discontinuity in SB eligibility. Labor income refers to wage income, profits from selfemployment and income from other activity; other insurance schemes refer to social welfare benefits, unemployment benefits and sickness/disability benefits; public SB refers to first pillar survivors insurance; and occupational SB refers to second pillar survivors pension plans. We first verify the large effect of the reform on first pillar survivors benefits (panel (a) of Figure C.2). Before the reform, benefits largely increase at spousal death (from 0 to 70% of minimum wage). This increase is much milder after the reform (from 0 to 20% of minimum wage). We check that at spouse's death, first pillar SB become positive. After spouse's death and on average, first pillar SB are equal to 70% of minimum wage for the non-treated cohorts (those born before 1950) while they are only equal to 20% for the treated ones, which illustrates the important financial effect of the reform as previously shown. Interestingly, we do not observe such a pattern for second pillar pension (occupational SB, panel (b)). This suggests that second pillar pension schemes did not follow nor compensate for the cut in benefits implemented in the first pillar. However, as shown in panel (e), higher labor income for youngest cohorts does not compensate SB loss and total income after spouse's death is lower for these cohorts than for the eldest ones.

Figure 3: Average labor supply according to distance to spouse death



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

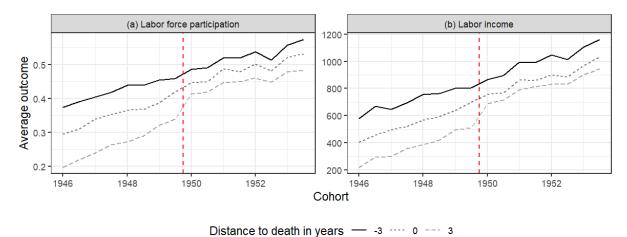
Finally, we give more direct graphical evidence of the causal effect of SB elimination on labor supply in Figure 4. It presents the average labor force participation and labor income by cohort of birth, for different values of the distance to spousal death event in years (-3; 0; +3). For the pre-death period (distance to death = -3), labor force participation and labor income follow a smooth and upward trend over cohorts of birth. On the contrary, three years after death, labor supply follows an upward trend over the cohorts with a big jump for 1950 cohort of birth. Individuals born after 1950 thus seem to have increased their labor supply at spouse's death in reaction to the SB elimination. These patterns are at the heart of our RD empirical strategy: we observe a jump in labor supply between widows born on both sides of the 1950 cutoff, and this jump is observable from the moment of spousal death, when the reforms kicks in. This makes a strong case for the identification of a causal effect of the SB reform on labor supply of widows.

4.2 Estimation results

Before turning to regression results, Figure 5 isolates the t=3 line of Figure 4 and presents, for labor force participation and labor income, the average level by cohort of birth three years after spousal death, along with confidence intervals and a linear fit from each side the cutoff. This gives a clearer view of the discontinuous increase in labor supply between widows born before and after the 1950 cutoff.

Table 3 shows the coefficients for estimation of equation (1) three years after spousal death and for different specifications of polynomial m(): three for a polynomial of order 1, 2 and 3,

Figure 4: Average LFP and LI according to cohort of birth and distance to death

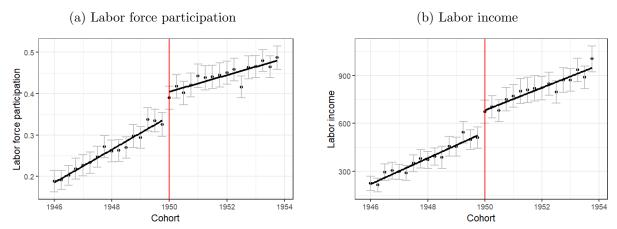


NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

Figure 5: Average participation and income by date of birth, three years after spousal death



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. Both outcomes are measured three years after the death of the spouse. Confidence intervals are displayed at the 95% level.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

respectively, and one of order 1 with slopes set to be equal on each side of the discontinuity. For labor force participation, RD estimates take values ranging from 0.043 to 0.062. It means that three years after spouse's death, treated individuals have a 4.3 to 6.2 percentage points higher labor force participation than control group. All coefficients are significantly different from 0. In terms of labor income, estimates vary between 130 and 140 monthly euros. In the rest of the paper, we keep the first specification as our preferred specification, with a first order polynomial

and different slope on each side of the discontinuity.

Table 3: Regression discontinuity estimates

	(a) Labor force participation					(b)	Labor inc	ome		
	(1)	(2)	(3)	(4)	(5)	(1)	(2)	(3)	(4)	(5)
δ	0,060	0,054	0,043	0,062	0,060	140	130	110	140	140
Std. err.	0,010	0,015	0,021	0,010	0,010	24	37	52	24	24
p value	0,000	0,000	0,040	0,000	0,000	0,000	0,000	0,044	0,000	0,000
Parametric	✓	✓	✓	✓	✓	✓	✓	✓	✓	\checkmark
Poly. order	1	2	3	1	1	1	2	3	1	1
Equal slopes	Χ	X	X	\checkmark	Χ	X	X	X	\checkmark	Χ
Controls	✓	✓	✓	\checkmark	Χ	\checkmark	\checkmark	\checkmark	\checkmark	Χ
Time basis	quarter	quarter	quarter	quarter	quarter	quarter	quarter	quarter	quarter	quarter
Nb obs.	38,340	38,340	38,340	38,340	38,340	38,340	38,340	38,340	38,340	38,340

NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. All estimates are based on a 8-years symmetric bandwidth.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

Our results are robust to the period on which outcomes are observed, population selection and presence of controls, as shown in Table 4. We run the estimation for different bandwidth around the discontinuity. We make bandwidth varying from 0.5 to 3.5 around the 1950 threshold. In other words, we estimate the RD equation for individuals born a quarter around January, 1st 1950, then for individuals born six months around January, 1st 1950 and so on until individuals born three years around the threshold. Appendix Figure C.3 shows the estimated effects of the reform according to the different bandwidths. We verify the estimates are relatively stable along the bandwidths, in the range 4.1 to 7.9 pp for labor force participation and 110 to 190 euros for labor income.

Dynamic of the effect. We then estimate equation (1) for each quarter t between -3 and +3 years relative to the date of spousal death. Figure 6 shows the estimated δ_t coefficients, along with their 95% confidence intervals. The goal of this approach is twofold. First, we can assess the timing of the labor supply response to the reform. Second, it is a way to check that the interactions with the contemporaneous pension reforms we are of limited magnitude.

In terms of dynamics, we observe that the increase in labor force participation (panel (a)) and labor income (panel (b)) kicks in immediately with a large labor supply response from t = 0. The effect then progressively increases over time, and approximately doubles from 6 months to 3 years after the death of the spouse. As the effect seems to continue to increase beyond our three year window, it is likely that we do not observe the full dynamics of the effect. In Giupponi

Table 4: Regression discontinuity estimates, robustness checks

	(a) Labor force participation			(b)	Labor inc	ome
	(1)	(2)	(3)	(1)	(2)	(3)
δ	0.046	0.069	0.060	110	200	140
Std. err.	0.009	0.020	0.010	26	52	24
p value	0.000	0.000	0.000	0.000	0.000	0.000
Specif.	average	$age \leq 57$	controls	average	age≤57	controls
Controls	\checkmark	\checkmark	Χ	\checkmark	\checkmark	Χ
Time basis	quarter	quarter	quarter	quarter	quarter	quarter
Nb obs.	38,340	13,239	38,340	38,340	$13,\!239$	38,340

Note: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. Average refers to average outcome over the 3-years period after death and $age \le 57$ means we reduced the scope to individuals who were aged lower than 57 at spouse's death. All estimates are based on a 8-years symmetric bandwidth.

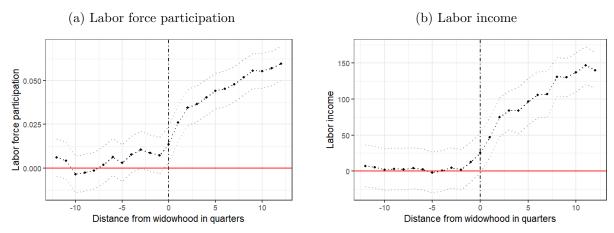
Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

(2019), the labor supply responses to a cut in survivors benefits steeply increase from t = 0 to t = 7 years before they relatively stabilize. This suggests that we may underestimate the long term responses to the reform in our setting. In Appendix Figures C.4 and C.5, we verify that our results are robust to time basis used for the estimation of equation (1) (semester or month).

Figure 6 also shows that there is no detectable effect of the SB reform before spousal death. This first suggests that there is no anticipation effect of the reform before spousal death. This could be explained by the fact that we consider relatively young individuals (around age 50-60) for which spousal death may not be anticipated. Secondly, the absence of effect before t=0 suggests that our estimation of the effect of the SB reform is not biased by the effect of the contemporaneous pension reforms affecting individuals in the vicinity of the 1950 cutoff (see section 2). As there is no clear reason why those reforms would affect individuals deferentially before and after the death of the spouse, the absence of effect before death suggest that the interaction with the pension reforms is not a major issue in our setting.

Figure 6: Effect of the reform on the labor supply over time



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent 95% confidence intervals.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

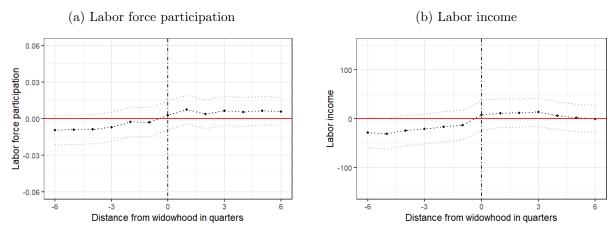
Placebo analyses. As last checks for the validity of our identification strategy, we implement the following placebo tests. We estimate equation (1) with two alternative samples and placebo cutoffs, where no change in SB were implemented. In the first (resp. second) placebo test, we consider individuals born between January 1946 and December 1951 (resp. January 1948 and December 1953) and a placebo cutoff in January 1949 (resp. 1951). We expect no significant change in labor supply at the cutoffs. Figures 7 and 8 present the estimated coefficients of the RD model (1) for each quarter t three years before and after spousal death. Reassuringly, we do not find much effect of those pseudo-reforms, except for the pre-death estimates of the second placebo, which exhibits some significant but very small positive effects.

Interestingly, the first placebo is also a validity check for the interaction of the SB reform we study with the change in the state pension age. Recall that the SB reform is almost contemporaneous with a 1 month increase in the state pension age occurring in 2013. A similar change was implemented for the individuals born in December 1948 (from 65 and 1 month to 65 and 2 months), which is very close to the cutoff of our first placebo. The null effects found for this placebo also suggests that our main analyses' estimates are not tampered with the effects of the increase in the state pension age.

4.3 Magnitude and interpretation

In this section, we discuss the magnitude of our results and compare it to the effects found in the literature. In order to make our results comparable to other studies, we relate the estimated

Figure 7: Effect of the reform on the labor supply (placebo 1949)

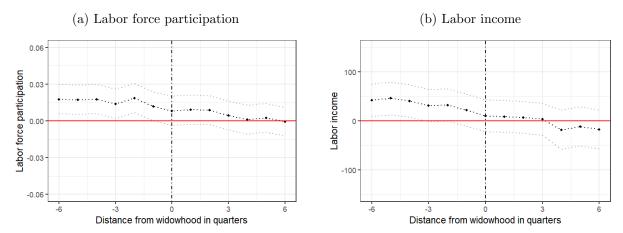


NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. In this placebo specification, we set 1949 as the counterfactual discontinuity date of birth. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent 95% confidence intervals.

Scope: Widows born between 1946 and 1951 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

Figure 8: Effect of the reform on the labor supply (placebo 1951)



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. In this placebo specification, we set 1951 as the counterfactual discontinuity date of birth. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent 95% confidence intervals.

Scope: Widows born between 1948 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

labor supply effect to (i) the pre-reform level of employment and (ii) the magnitude of the financial incentives generated by the reform.

Table 5 displays the percent change in labor force participation and labor income induced by the SB reform. It is defined as the estimated effect of the reform on the outcome of interest divided by the baseline before the reform was enacted. We use our RD design equation (1) three years after spouse's death:

$$Y_i = \alpha + \beta . m(dob_i - 1950) + \delta . \mathbf{1}_{dob > 1950} * m(dob_i - 1950) + \gamma . X_i + \epsilon_i$$

Recover that δ is the effect of the reform on Y_i , taken to be labor force participation or labor income. In this specification, α captures the baseline level for individuals belonging to non treated cohorts, β captures the underlying trend and λ is a vector of the estimated parameters for control variables. We estimate the treatment effect of SB elimination as the full-exposure impact for cohort 1951. The baseline for this population then equals $\alpha + \beta_{left}.m(1951-1950) + \lambda \bar{X}_{i\in 1951} = \alpha + \beta_{left} + \lambda \bar{X}_{i\in 1951}$, as we chose an order 1 polynomial for m() and different slopes on each side of the discontinuity in our main specification. More precisely, β_{left} refers to the slope to the left of the discontinuity The full exposure effect of the reform is then equal to:

$$effect = \frac{\delta}{\alpha + \beta_{left} + \lambda \bar{X}_{i \in 1951}}$$

As shown in Table 5, labor force participation baseline for cohort 1951 is 38% so the 6 pp effect of the SB corresponds to a 15.82% increase. Similarly, labor income baseline is 611 monthly euros, so the reform translated in a 23% increase for 1951 cohort.

Table 5: Main RD estimates and average effect

	(a) Labor force participation	(b) Labor income
δ	0.06	140
Baseline	0.38	611
Effect (in $\%$)	15.82	22.90
Nb obs.	38,340	38,340

NOTE: Labor force participation and is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. RD estimate is computed on the full population while baseline and reform effect focus on the 1951 cohort of birth. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

In order to be compared with other studies, the labor supply response to the reform must be re-scaled to the magnitude of the financial incentives it embedded. We thus compute a labor supply elasticity at the extensive margin with respect to the change in total income to compare our results to the related literature. This corresponds to normalizing the reform effect on labor force participation by the percent change in total income that is attributed to survivors' benefits. As we do not observe this latter value for the 1951 cohort, we extrapolate the SB share of total

income for the non treated cohorts. This indicator happens to be flat over the cohorts born before 1950 and is equal to 42%. We then consider than the SB reform induced a -42% variation in treated individuals total income. We end up with an elasticity of labor force participation with respect to SB income equal to -0.38.

Our results are roughly in line with the other estimates available in the literature. Our estimated elasticity is slightly smaller than the one found by Giupponi (2019) (participation elasticity of -0.6) and very close to the one computed by Fadlon et al. (2019), equal to -0.35. However, we must remain cautious when comparing the different elasticities as external validity of each study is likely to be limited, for at least four reason.

First, we estimate a combination of income and substitution elasticity. Indeed, following a spouse's death, survivors may decrease their labor supply in order not to be means-tested and benefit from full SB (van der Vaart et al. 2020). The elimination of the Dutch SB scheme thus may have translated into a stabilization of labor supply for some individuals, compared to the decrease it would have induced if the reform would not have been enacted. However, in our setting, the benefits are phased-out from labor income above 50% of the minimum wage, with a rate of 66%. In particular, we can see that only the first kink point in the budget set (50% of minimum wage threshold, Appendix Figure C.6) may be an incentive to bunching (Saez 2010). We nevertheless do not find any evidence of such behavior among widows (Appendix Figure C.7). We therefore believe that the substitution effect is limited in our setting. Giupponi (2019) faces the same issue, and focuses on high income widow(er)s so as to neutralize the substitution effect of the reform she exploits.

Second, the populations on which are based the analyses may differ between papers. Since different populations are also likely to respond differently to SB reforms (as shown in section 5.3), this could generate differences between the estimated elasticities. We focus on widows born between 1946 and 1953, whose husband died from January 2003, before they reached 62 of age and who do not care for a child. Giupponi (2019) focuses on high-income survivors, she restricts her sample to individuals aged 55 and under at the time of their spouse's death. Her population is therefore younger as ours. Our population of analysis is much more similar to the one in Fadlon et al. (2019), since they focus on the age 60 discontinuity for eligibility to the US scheme.

Third, since the SB reform responses exhibit a dynamic pattern (cf. Figure 6), consistent elasticities must be computed on similar time windows. We measure our elasticity in t=3 years after spouse's death, which is not in line with Giupponi (2019) and Fadlon et al. (2019). The former compute an elasticity based on the average response over the 15-years period following

death and the latter measure an elasticity based on the average response over the two-years period following death.

Finally, the response to the reform can depend on the salience and timing of the reform. In our case as in the other papers, we stress that the individuals were aware of the reform. In particular, for the Dutch context, the reform was enacted in July 1996 but had been discussed since March 1991 in the Parliament and December 1992 in the Senate. Moreover, it was decided that the reform would apply to widows born after January 1st, 1945 (instead of 1950) until very late (this was still the case in the memorandum of explanation of the law, in April 1996). Those affected by the reform have therefore had plenty of time to anticipate its effects.

5 Decomposition of the labor supply response

In this section, we provide additional results to understand the mechanisms at stake in widows' response to SB elimination. In particular, we decompose our results into an extensive and an intensive margins, we provide evidence of substitution effects toward other social security programs and we show response heterogeneity.

5.1 Intensive and extensive margin responses

Widow's response to the SB reform in terms of labor supply may be the combination of different effects, whose public policy's implications are divergent. Indeed, an increase in female labor force participation could overall be desirable, but there might be a quantity-quality trade-off in the chosen job. Low-qualified jobs offer a pretty easy way to increase one's labor force participation because such positions generally do not suffer from competition. These correspond to sectors in which widows can adapt the number of worked hours to their income needs. Conversely, the working conditions in these sectors are generally harder either because of the lack of recognition or the rough working environment. We decompose the different margins of labor supply response to provide insights on the degree of constraint introduced by the reform.

Extensive margin: decomposition by sector of activity. In the previous section, we showed that the elimination of survivors benefits induced an important response on the extensive margin (labor force participation). We now investigate the activity sector composition of the job positions widows have taken following their spouse's death. Our dataset provide complete information on the 5-digits classification sectors occupied by working widows. It let us shed light on a dimension that has never been looked in the literature: the nature of the activity sectors that absorb the flow of extra widowed workers.

We first examine labor force participation response according to whether individuals chose a salaried job or to become self employed. As shown in Appendix Figures C.8 and C.9, almost all widows who decided to enter the labor market after their spouse died, did so as wage earners. We find no significantly different from zero response to the SB reform on labor force participation as a self-employed.

We go further into the decomposition and we study whether an activity sector is favored by widows who decide to work on the labor market after the death of their spouse. Figure 9 displays the RD coefficients for labor supply participation for each one of the 1-digit classification activity sector. We can see that most of the response to SB reform is driven by a higher participation in the caring sector. We propose two interpretations of this result. First, entering formal caring sector can be seen as a logical consequence of informal caring. Indeed, (i) widows may have cared for their sick spouse before he died and (ii) many positions within the care sector only require low qualifications. Second, care sector is a sector that is short of human resources. It is therefore easier to enter this sector than others, even after an absence of several years on the job market.

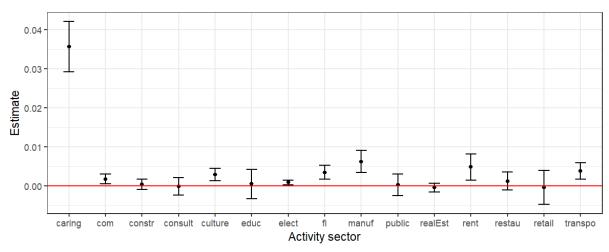


Figure 9: RD coefficients for labor supply participation by activity sector

Note: Caring stands for sector of care, com for communication, constr for construction, consult for consultancy, educ for education, elect for electricity, gaz and water, fi for finance, manuf for manufacturing, realEst for real estate, rent for renting, restau for restauration, and transpo for transportation sectors, respectively. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth. Confidence intervals are displayed at the 95% level.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

We finally clarify our contribution and display heterogeneity results for participation to caring sector according to working status before spouse death. We want to distinguish between widows

⁸The corresponding RD graphs are presented in Appendix Figure C.10.

who were already working before their spouse's death and decided to switch activity sectors and those who just entered the labor market. As shown in Figure 10, caring sector integration as a response to SB elimination is entirely driven by widows who were not working on the labor market during the year preceding their spouse's death. We find no significantly different from zero evidence of a switching towards caring sector behavior. This last result nevertheless does not exclude the possibility that the widows entering the care sector after their spouse death had already worked in this sector in the past (at least three years, as defined in our analyses).

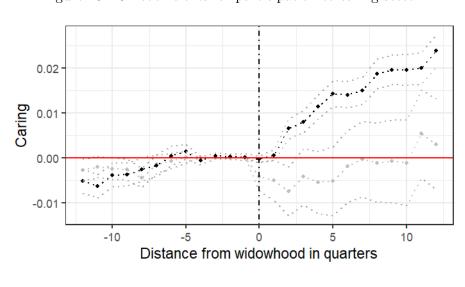


Figure 10: RD coefficients for participation to caring sector

Was... · · · not working · · · working no care

NOTE: Caring is a dummy equal to 1 if widow works in the caring sector and labor income > 0 and 0 otherwise. We look at response to the reform according to whether the widow was not working during the year preceding spouse's death or if she was working but in a different from caring activity sector. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent the 95% confidence intervals.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

Intensive margin: hours worked and hourly wage. We then decompose the intensive margin response between hours worked and wage rate responses. Our dataset provide precise information on the number of hours worked and wage rate, on a monthly basis, for the whole widowed population, three years after their spouse's death. This allows for a direct estimation of intensive margin responses, while there were proxied using working days in previous literature (Giupponi 2019, Böheim & Topf 2021).

We first focus on the population of widows who were working before their spouse's death and look at whether they adjusted the number of hours worked or the wage rate following the death. We restrict the sample to individuals who were working during the year preceding spouse's death.

The RD estimates in Table 6 show a significant response to the reform in terms of hours worked while no significant response in terms of wage rate (see columns (a) and (b)). Widows increased their number of monthly working hours by 9 hours. Compared to the baseline, it represents a 16% increase. The corresponding RD graphs are presented in Appendix Figure C.11. However, this result mixes extensive and intensive margins since some widows (more numerous among the control population) decreased to zero the number of hours they work when they decided to stop working following their spouse's death.

Table 6: Intensive margin RD estimates three years after spouse's death and average effect

	(a) Hours	(b) Hourly wage	(c) Intensive margin
δ	9	0.45	7
Std. err.	2	0.30	2
Baseline	57	16.90	85
Effect (in $\%$)	16.10	2.67	8.29
Nb obs.	17,599	11,130	11,130

NOTE: Hours response is conditional on working at least once during the year preceding spouse's death. The sample thus contains zero hours working individuals. Intensive margin is estimated as hours response on the restricted sample of widows who have worked in each period of the three-years period around spouse's death. Zero hours working are thus excluded. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

We then decide to estimate an intensive margin response to the reform defined as the adjustment in hours worked for widows who decided to work in each period of the six-years period around spouse death. Column (c) in Table 6 shows that the reform increased the number of monthly working hours by 7 among widows who always worked on the period of analysis. Compared to the baseline, it represents a 8% increase. The results then suggest that not only surviving spouses entered or reentered the labor market, but also already working widows moved from part-time to full-time or at least increased their workload.

5.2 Program substitution responses

The elimination of SB may induce widows into taking up more of other insurance schemes, either in order to increase their disposable income or as a consequence of the negative health effect following the wealth drop after spouse's death. Such substitution effects would limit the labor supply responses of the SB reform, and generate negative externalities of the reform on public spending. We investigate whether the SB reform had an impact on the number of disability, unemployment or welfare beneficiaries among the widowed population. Disability benefits are

provided to former workers that are at least 35% incapacitated for work. Unemployment benefits are served to individuals who used to be employed or are employed under a certain workload and who do not receive disability benefits. Welfare benefits are a safety net for individuals with income below a certain threshold who do not receive disability nor unemployment benefits.

From a financial point of view, we expect widows to react to the reform with an increase in the take-up of other social security schemes. Indeed, SB are one-to-one reduced with disability, unemployment or welfare benefits (DB, UB and WB, respectively). Before the reform, individuals whose SB are higher than expected DB, UB or WB may decide not to claim. Conversely, after the reform, many individuals loose eligibility to SB and therefore have a higher financial incentive to claim other social security benefits.

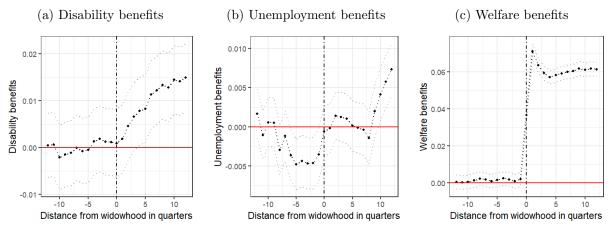
As a second order response to the SB reform, we presume that the direct health effect of spousal death on widows is less mitigated without SB. Indeed, without SB, there is no compensation of the negative wealth shock following spouse's death. It may translate into a lower health status and work capabilities for the widows, which could translate into an increase in the take-up of disability or unemployment insurances.

Figure 11 provide the RD estimates for being a disability, unemployment or welfare beneficiary, respectively, for each event during the six-years period around spouse's death. The proportion of widows who receive welfare benefits mechanically increased following the SB reform (panel (c)). Indeed, without survivors benefits, more of them were living below a certain income threshold. They then became eligible to welfare benefits and it translated in a 6 pp increase in the proportion of beneficiaries three years after spouse's death (while the baseline was almost null). More importantly, we find empirical evidence of an increased proportion of widows receiving disability benefits (+1.5 pp compared to the 12.7% baseline). Finally, we do not find any evidence of an increased proportion of unemployment beneficiaries following the SB reform.

5.3 Heterogeneity in labor supply response

The overall labor supply effects we estimate may hide substantial heterogeneity across subgroups. We study how different the responses to the reform are, according to self-insurance level before spouse death. Indeed, the necessity, efficacy, and cost-effectiveness of government welfare policies depends on the risks that households face and the actions that they can take to self-insure, for instance by adjusting their saving and labor supply. Said differently, larger labor supply responses – which correspond to a stronger need to self-insure – imply a greater scope for welfare-improving social insurance due to lack of adequate formal insurance. We distinguish

Figure 11: Effect of the reform on other social security programs



NOTE: Disability benefits, unemployment benefits and welfare benefits are dummies equal to 1 if disability, unemployment or welfare benefits respectively are > 0 and 0 otherwise. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent the 95% confidence intervals.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

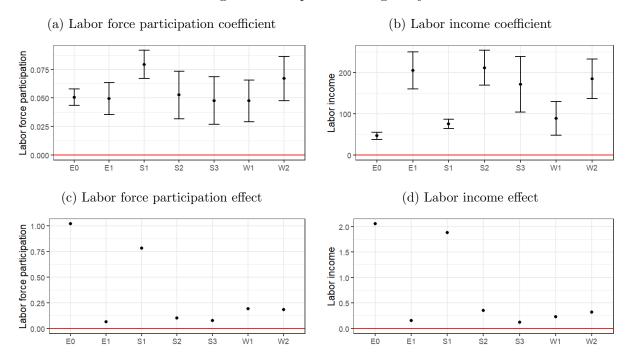
individuals according to their working status before death, the share in the total household income they hold and their level of liquid wealth.

We first carry out the RD analyses separately on two sub-population according to whether the widow worked during the year preceding spouse's death or not. On one hand, one would expect that widows who were already integrated to the labor market react more to the SB elimination than the others, as they are able to adjust their labor supply more easily. On the other hand, one would expect that widows who were not working at the time of their spouse's death react more because their ex-spouse's income was probably their main source of income. In that case, labor supply response is a direct mean to self-insure. Figure 12 shows evidence for our second possible interpretation. Indeed, both sub-populations (E0 for non working widows and E1 for the others) show a 5 pp increase in labor force participation following the reform. Compared to the baselines, this translates into a 102% and a 7% increase, respectively. In terms of labor income, the SB reform induced a 47 monthly euros and a 205 monthly euros increase, that is to say a 205% and a 16% increase, respectively. RDD estimates according to distance to spouse's death graphs are shown in Appendix Figure C.12.

According to OECD (2018), SB pursue the main objective of smoothing living standard after the partner's death. At spouse's death, household living standard varies with the losses of the partner resources and economies of scales. Accepted the modified OECD scale, a single-person

⁹The estimations based on the widows who did not work during the year preceding spouse's death are different from those that distinguish between intensive and extensive margins. Indeed, in the paper, the previous analyses on extensive margin (labor force participation) were carried out on the full population – i.e. widows who do not participate to the labor market are included, as well as those who were already on the market.

Figure 12: Response heterogeneity



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity.

E0 and E1 refer to employment status. Employment status is a dummy equal to 1 if widow worked at least once during the year preceding spouse's death (E1) and 0 otherwise (E0). S1 to S3 refer to income share tercile, which is the tercile of the widows' total household income share during the three-years preceding spouse's death. W1 and W2 refer to liquid wealth group, W1 being the group below the liquid wealth distribution median and W2 the above median group. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth. Confidence intervals are displayed at the 95% level.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

household requires 33% less household income to have the same standard of living as an otherwise comparable couple without children. In other words, all other things being equal, a survivor whose share of total household income was below $\frac{2}{3}$ decrease her living standard following a spouse's death and increase it otherwise. One should then expect that widows whose income share is low to react more than the others in order to limit the decrease in living standard. Given the fact that very few women have a total household income share above $\frac{2}{3}$, we divide the widowed population into three terciles of income share. We empirically find 8% and 33% as first and second thresholds. The estimates for the separate RD analyses are displayed in Figure 12 (S1 for first, S2 for second and S3 for third income share terciles). Consistent with the smoothing living standards objective, we find that widows belonging to the lowest income share category respond more to the SB reform that the others. The results even show a negative gradient in response magnitude with regards to income share level. Indeed, widows belonging to the S1 sub-population increased their labor force participation by 78% versus 10% for S2

and 8% for S3 (corresponding to a 7.9 pp 5.3 pp and 4.8 pp increase, respectively). In terms of labor income, the SB reform translated into a 188%, 35% and 13% increase for S1 to S3 sub-populations, respectively. RDD estimates according to distance to spouse's death graphs are shown in Appendix Figure C.13.

Finally, we investigate response heterogeneity according to liquid wealth. We define liquid wealth as total wealth excluded housing wealth. Indeed, we believe that the latter is more difficult to use for consumption smoothing when facing an economic shock. Conversely, individuals can quite easily smooth their living standard through dissaving. One would expect widows with a high liquid wealth level to react less to the SB reform because they are able to smooth their living standard using financial wealth without adjusting labor supply. We separately carry out the RD analysis on two sub-population defined according to liquid wealth level (below and above the median). Surprisingly, as shown in Figure 12, we do not find any evidence of a wealth gradient in response to the SB reform.

6 Conclusion

This paper provides novel insights on the causal effects of public survivors insurance on labor supply outcomes. We exploit the 1996 Dutch reform that enacted a large one-time drop in survivors benefits for individuals born after January, 1st 1950, using high quality administrative data. Consistent with previous literature, and based on a regression discontinuity design, we show that a decrease in SB increases labor supply. We thus provide empirical evidence that SB schemes are a disincentive to female employment. We find a stronger labor supply response for widows with less ability to self-insure against the loss of income following spousal death, as well as substitution towards disability insurance.

Taken together, the effects we find raise the question of whether survivor insurance schemes are still needed (OECD 2018), or should just be reformed (James et al. 2009). Some countries decided to lower SB and introduced a means-test while others, like the Netherlands, eliminated the scheme and replaced it with temporary benefits (Monticone et al. 2008). As SB schemes represent 13% of old-age benefits in average in OECD countries (OECD 2018), and contribute to lower the gender pension gap, their modification remains very sensitive.

Overall, our results suggest that the elimination of the survivors benefits schemes neutralizes the disincentive to female employment, but constrains some widows to take up other social security programs. Our findings also suggest potential welfare gains from reintroducing (or maintaining) public survivors insurance dedicated to the most disadvantaged, then highlighting the protective insurance role of SB schemes.

The results presented in this paper could be expended in several directions. First, even if our findings support labor supply as a key self-insurance mechanism against the income shock following a spouse's death, we do not find evidence of the importance liquid wealth in the labor supply response. This is at odds with expectations and requires further investigation. A way to shed light on this question is to investigate the economic consequences of a spouse's death on labor supply and wealth des-accumulation, with regards to living standard variation at the time of death. Another possible indirect but important channel for the long run effect of SB elimination is its health effects. As the death of a spouse has an impact on the survivors' mental health (Siffinger 2017) and this mental health is correlated with income (Stewart-Brown et al. 2015), we can expect some effects of the large income drop generated by the SB reform. Finally, the drop in SB induced by the reform modified the gain from marriage. Indeed, according to the marriage market theory of Becker (1973) and conditional on the spouse's death, SB provide benefits to the survivor that renders utility deriving from marriage, called marriage surplus. As shown by Persson (2020) in the Swedish case, a SB reform can modify the marriage and divorce decisions. Analyzing the effect of cut in SB on the health of surviving spouses one the one hand and on conjugality, on the other hand, are therefore interesting avenues for future research.

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A Complements on institutional context

Table A.1: Survivors' benefits legislation before and after 1996 reform

		Before reform	After	reform
		Defore reform	born before 1950*	born after 1950
Eligibility	Matrimonial	marriage	marriage or	marriage or
Engionity	status		partnership or	partnership or
			cohabitation	cohabitation
	Individual	+40 y.o.		cares for a minor child
	charac.			
	If minor	100% min. wage	70% + 20% min. wage	90% min. wage
Benefits	child			
Denents	If no child	70% min. wage	70% min. wage	
	Means test	No	Yes**	Yes**
	Stop when	reach AOW-age or	reach AOW-age or	reach AOW-age or
		remarriage	new household	child gets 18 or new household

 $^{^*}$ Survivors born before january, 1st 1956 and whose partner deceased before July, 1st 1999 are considered as if they were born before January, 1st 1950.

^{**} Means test only applies on the 70% of minimum wage while the 20% of minimum wage linked to the care of a minor child are not until 2013. Means test apply on all benefits (90% of minimum wage) from 2013 onward. Source: Legislation

B Data

The data used in this study for divorce probability analyses are individual-level or household-level data provided by Statistics Netherlands (CBS). There are accessible via a remote access environment in a set of different datasets. In a dataset, each individual is identified by a unique number (which has been pseudomyzed). The linkage of the different datasets is performed using the individual identifier, and is thus exact.

Table B.1 provides the list of the microdata used in this research. The civil-status histories cover each resident's past and present partnership, marriage, separation, divorce and widow(er)hood. For each event, the data indicate the exact date of happening. Leveraging the spousal and child identifiers, we are able to link individuals to their spouses and children and then get information on these. Administrative files of Anw beneficiaries are available from 2005. We link information on survivors' benefits nature and amount to individuals belonging to the Dutch registers. We mobilize individual income sources. These are available from 1999 and give information, on a monthly basis, on nature and amount of income. We also use the employees database to get information on activity sector, wages and hours worked (from 2006 onward). Finally, we mobilize wealth database to get information on wealth (from 2007 onward). We can distinguish liquid wealth (financial assets) from total wealth.

Table B.1: Datasets used

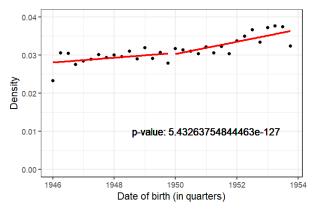
Content	Name of dataset	Source
Date of birth and gender	GBAPERSOON2019TAB (V1)	Population registers
Death	GBAOVERLIJDENTAB2019TAB (V1)	Death records
Civil status and date Households characteristics	GBABURGERLIJKESTAAT2019BUS (V1)	Population registers SSB
Linkage parent-child	GBAHUISHOUDENS2019BUS (V1) KINDOUDER2019TAB (V1)	Population registers
Anw benefits	090106 ANW 2005 (V1)	SSB
Till belieffes	090109 ANW 2006 (V1)	SSB
	090112 ANW 2007 (V1)	SSB
	090112 ANW 2008 (V1)	SSB
	100208 ANW 2009 (V1)	SSB
	110316 ANW 2010 (V1)	SSB
	120535 ANW 2011 (V1)	SSB
	130206 ANW 2012 (V1	SSB
	140324 ANW 2013 (V1)	SSB
	ANWUITKERING1ATAB2014MM (V2)	SSB
	ANWUITKERING1ATAB2015MM (V2)	SSB
	ANWUITKERING1ATAB2016MM (V1)	SSB
	ANWUITKERING1ATAB2017MM (V1)	SSB
	ANWUITKERING1ATAB2018MM (V1)	SSB
	ANWUITKERING1ATAB2019MM (V1)	SSB
Individual income		~
Wage income	SECMWERKNDGAMNBEDRABUSV20181	SSB
Profits from self-employment	SECMZLFMNDBEDRAGBUSV20181	SSB
Income from other activity	SECMOVACTMNDBEDRAGBUSV20181	SSB
Social welfare benefits	SECMBIJSTMNDBEDRAGBUSV20181	SSB
UI benefits DI and sickness benefits	SECMWERKLMNDBEDRAGBUSV20181	SSB
	SECMZIEKTAOMNDBEDRAGBUSV20181 SECMSOCVOORZOVMNDBEDRAGBUSV20181	SSB
Other social security benefits Pension income	SECMPENSIOENMNDBEDRAGBUSV20181	SSB SSB
Activity sector, wage and hours worked	POLISBUS 2006 (V2)	SSB
Activity sector, wage and nours worked	POLISBUS 2007 (V1)	SSB
	POLISBUS 2008 (V1)	SSB
	POLISBUS 2009 (V1)	SSB
	SPOLISBUS 2010 (V1)	SSB
	SPOLISBUS 2011 (V1)	SSB
	SPOLISBUS 2012 (V1)	SSB
	SPOLISBUS 2013 (V2)	SSB
	SPOLISBUS 2014 (V1)	SSB
	SPOLISBUS 2015 (V3)	SSB
	SPOLISBUS 2016 (V3)	SSB
	SPOLISBUS 2017 (V2)	SSB
	SPOLISBUS 2018 (V5)	SSB
	SPOLISBUS 2019 (V5)	SSB
Total wealth, liquid wealth	VEHTAB 2007 (V2)	SSB
	VEHTAB 2008 (V2)	SSB
	VEHTAB 2009 (V2)	SSB
	VEHTAB 2010 (V2)	SSB
	VEHTAB 2011 (V5)	SSB
	VEHTAB 2012 (V5)	SSB
	VEHTAB 2013 (V5)	SSB
	VEHTAB 2014 (V5)	SSB
	VEHTAB 2015 (V5)	SSB
	VEHTAB 2016 (V2)	SSB
Activity sector (1digit classification)	VEHTAB 2017 (V2)	SSB
Activity sector (Taigit classification)	BETAB 2006 (V1) BETAB 2007 (V1)	SSB
	BETAB 2007 (V1) BETAB 2008 (V1)	SSB
	BETAB 2008 (V1) BETAB 2009 (V1)	SSB SSB
	BETAB 2009 (V1) BETAB 2010 (V1)	SSB
	BETAB 2010 (V1) BETAB 2011 (V1)	SSB
	BETAB 2011 (V1) BETAB 2012 (V1)	SSB
	BETAB 2012 (V1) BETAB 2013 (V1)	SSB
	BETAB 2014 (V2)	SSB
	BETAB 2015 (V125)	SSB
	BETAB 2016 (V124)	SSB
	BETAB 2017 (V124)	SSB
	BETAB 2018 (V124)	SSB
	BETAB 2019 (V121)	SSB

Note: SSB stands for $Sociaal\ Statistisch\ Bestand\ (Social\ Statistical\ Database).$

Source: CBS microdata catalogue.

C Additional Tables and Figures

Figure C.1: Distribution of widows by date of birth and McCrary test



NOTE: The graphs plot the empirical probability density function of widows by quarterly date of birth. It also reports the test statistics and associated standard error in parenthesis of a McCrary test of the discontinuity in the probability density function of the running variable at the January 1950 threshold.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

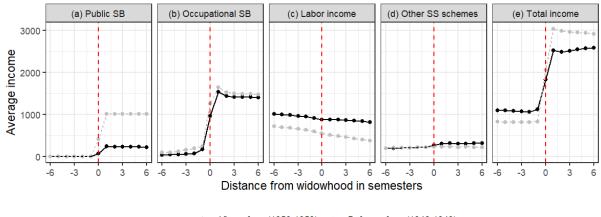
Table C.1: Covariate balancing tests

		Regress	sion disco	ntinuity		Mean
	(1)	(2)	(3)	(4)	(5)	(6)
Age at death	-0,10* (0,056)	0,00	-0,04	0,00	-0,04	59
Working status (in p.p.)	(0,056) $0,009$ $(0,01)$	(0) $0,009$ $(0,01)$	(0,086) $0,012$ $(0,016)$	(0) $0,013$ $(0,016)$	(0,07) $0,010$ $(0,011)$	0,40
Income share (in p.p.)	-0,005 $(0,005)$	-0,003 $(0,005)$	0,006 $(0,008)$	0,005 $(0,008)$	0,001 $(0,007)$	0,19
Labor income (in euros)	9,29 (80)	11,27 (82)	42,36 (124)	61,13 (125)	22,65 (87)	661
Wealth (in k euros)	-1,24 (9,94)	4,91 $(10,35)$	-8,31 (15,31)	-5,23 $(15,45)$	-3.81 (10,7)	229
Nb obs.	38,340	38,340	38,340	38,340	38,340	38,340

NOTE: The table reports the coefficient δ from estimating equation (1) for different outcome variables. Robust standard errors are reported in parenthesis. P-value: *** p<0.01. ** p<0.05, * p<0.1. Columns (1) and (2) are based on a linear parametric specification, without and with controls respectively. Columns (3) and (4) are based on a quadratic parametric specification, without and with controls respectively. Column (5) is based on non-parametric local linear regression. Column (6) reports the mean of the outcome variable in the control group. Working status refers to the proportion of individuals who have had at least a period of work during the year preceding death. All estimates are based on a 8-years symmetric bandwidth.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Figure C.2: Income level according to distance to spouse death

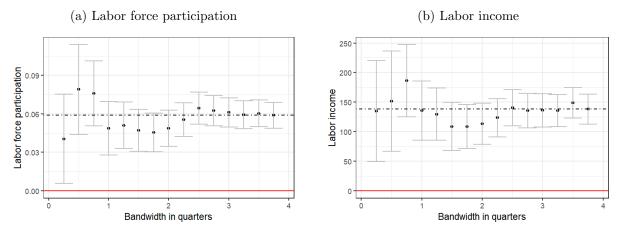


After reform (1950-1953) - * Before reform (1946-1949)

NOTE: SS stands for Social security. Public SB refers to first pillar survivors insurance. Occupational SB refers to second pillar survivors pension plans. It is computed as the difference between public SB and total pension. Labor income refers to wage income, profits from self-employment and income from other activity. Other social security schemes income refers to social welfare benefits, unemployment benefits and sickness/disability benefits. Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

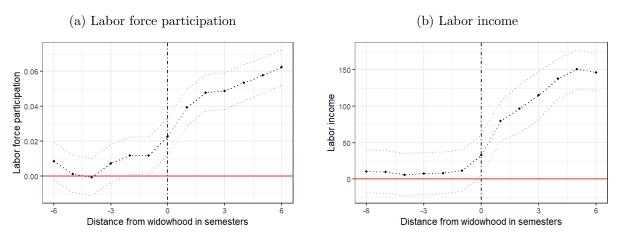
Figure C.3: Effect of the reform: sensitivity to bandwidth choice



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. All estimates are computed three years after spouse's death. Confidence intervals are displayed at the 95% level.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Figure C.4: Effect of the reform on the labor supply over time (semi-annual basis)

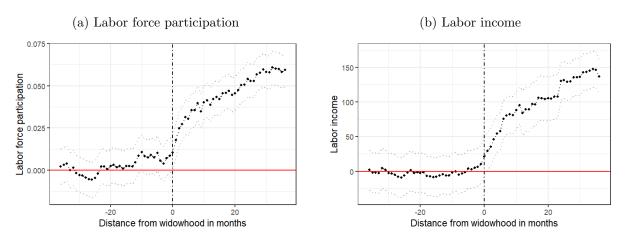


NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent 95% confidence intervals.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

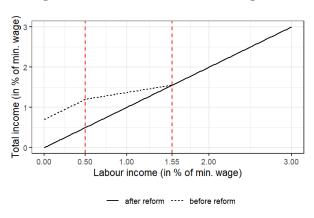
Figure C.5: Effect of the reform on the labor supply over time (monthly basis)



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent the 95% confidence intervals.

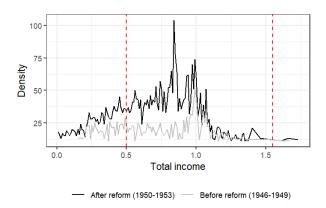
Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Figure C.6: Survivors benefits budget set



Source: Legislation.

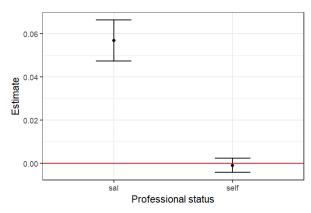
Figure C.7: Total income three years after spouse's death



NOTE: Total income includes (i) labor income that refers to wage income, profits from self-employment and income from other activity, (ii) survivors benefits and (iii) other insurance schemes income that refers to social welfare benefits, unemployment benefits and sickness/disability benefits.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time. Observations with null total income are filtered. Source: CBS.

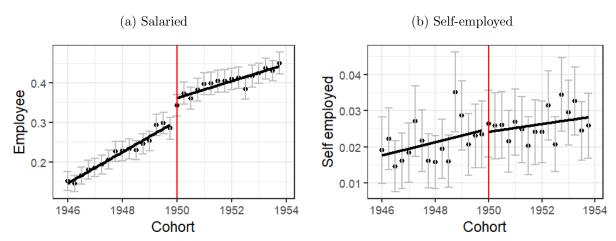
Figure C.8: RD coefficients for labor supply according to professional status



NOTE: Sal stands for salaried and self for self employed. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth. Confidence intervals are displayed at the 95% level. Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

Figure C.9: RD graph per professional status



NOTE: For each professional status, the RD graph represents the extensive margin response to the reform (our variable of interest is a dummy indicating whether labor supply is > 0 within the professional status considered). Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

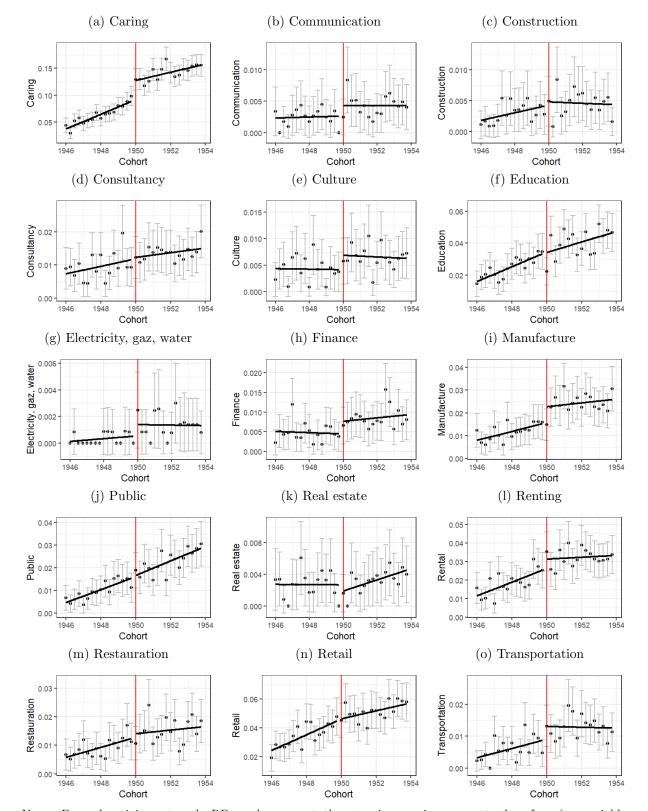
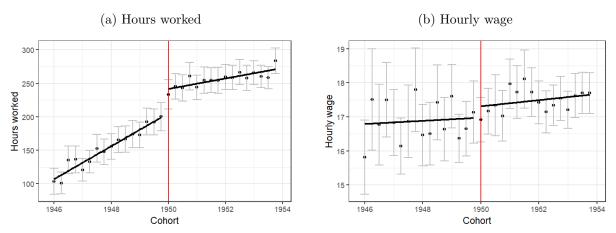


Figure C.10: RD graph per activity sector

Note: For each activity sector, the RD graph represents the extensive margin response to the reform (our variable of interest is a dummy indicating whether labor supply is > 0 within the activity sector considered).

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Figure C.11: Effect of the reform on the intensive margin

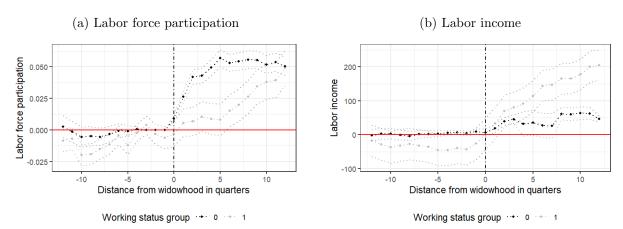


NOTE: Hourly wage is defined as wage income divided by the number of hours worked.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.

Source: CBS.

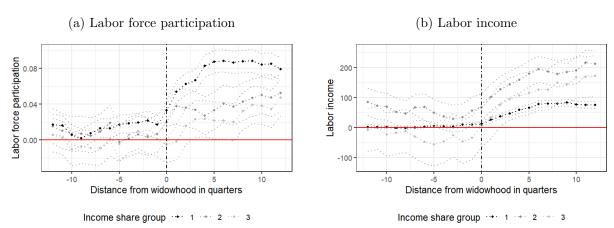
Figure C.12: RDD estimates per working status



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. Working status is a dummy equal to 1 if widow worked at least once during the year preceding spouse's death and 0 otherwise.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent the 95% confidence intervals.

Figure C.13: RDD estimates per income share tercile



NOTE: Labor force participation is a dummy equal to 1 if labor income > 0 and 0 otherwise. Labor income refers to wage income, profits from self-employment and income from other activity. Income share tercile is the tercile of the widows' total household income share during the three-years preceding spouse's death.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time. All estimates are based on a 8-years symmetric bandwidth. Dotted lines represent the 95% confidence intervals.

Table C.2: Elasticity heterogeneity

	(a) Work	ing status	(b) Income share tercile			
	(0)	(1)	(1)	(2)	(3)	
δ	0.05	0.05	0.08	0.05	0.05	
Effect (in %)	102	6.5	78	10.2	7.8	
Elasticity	-2.09	-0.22	-1.40	-0.28	-0.33	
Nb obs.	20,687	17,599	12,022	9,336	9,486	

NOTE: Working status is a dummy equal to 1 if widow worked at least once during the year preceding spouse's death and 0 otherwize. Income share tercile is the tercile of the widows' total household income share during the three-years preceding spouse's death. δ refers to the labor force participation RD estimate. All estimates are computed three years after spouse's death and are based on a 8-years symmetric bandwidth.

Scope: Widows born between 1946 and 1953 whose husband died after 2003, who do not care for a child and who were aged below 62 at death time.