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# Cash by any other name? Evidence on labeling from the UK Winter Fuel Payment



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#### ABSTRACT

Government transfers to individuals are often given labels indicating that they are designed to support the consumption of particular goods. Standard economic theory implies that the labeling of cash transfers or cashequivalents should have no effect on spending patterns. We study the UK Winter Fuel Payment, a cash transfer to older households. Our empirical strategy nests a regression discontinuity design within an Engel curve framework. We find robust evidence of a behavioral effect of labeling. On average households spend 47% of the WFP on fuel. If the payment were treated as cash, we would expect households to spend 3% of the payment on fuel.

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#### 1. Introduction

Government transfers to households and individuals are often given labels indicating that they are designed to support the consumption of a particular good or service. For example, many countries provide transfers to households with children and label them a "Child Benefit". When such transfers are made in cash there is no obligation to spend all, or even any, of the payment on its ostensive purpose. Standard economic theory implies that the label of a particular transfer should have no bearing on how that transfer is ultimately spent since all income is fungible. The recipient of a transfer with a suggestive label is expected to react in exactly the same way as he would have reacted had he been given a transfer of equivalent value with a neutral label. The receipt of an in-kind transfer such as food stamps is similar as long as

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consumers are infra-marginal — i.e. for those whom consumption of the good in question is already larger than the voucher amount. Why then do governments label transfers? One possibility, of course, is that doing so makes redistribution more palatable to voting taxpayers. Another intriguing possibility, though, is that standard economic theory is mistaken on this particular point, and spending patterns can be influenced by the labeling of cash or cash-equivalent transfers. In this paper we provide novel evidence on the behavioral effect of labeling from the UK Winter Fuel Payment (WFP).

The theoretical proposition that labeling is irrelevant has been challenged. For example, Thaler's (1990, 1999) framework of mental accounts is one mechanism through which the labeling of a transfer might affect its usage. There is, though, very little previous empirical evidence to support the idea that the labeling of a transfer payment matters.

Kooreman (2000) and Blow et al. (2012) find evidence that additional child benefit differs from other income in its effect on household spending patterns among child benefit recipients in the Netherlands and the UK respectively. Kooreman finds some evidence of a labeling effect (i.e. the child benefit is spent on child-related goods); in contrast,

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<sup>&</sup>lt;sup>1</sup> In the present context, income would be labeled according to its source, and so the Winter Fuel Payment would be allocated to a mental account for spending on heating.

Blow, Walker and Zhu's results suggest that child benefit is spent disproportionately on adult-related goods.<sup>2</sup> Finally, Edmonds (2002) also looks at child benefit payments (in this case among families in Slovakia) but finds no evidence of a labeling effect. These studies use quasi-experimental difference-in-difference designs, exploiting differential changes over time in the real value of benefits for different types. Effects are identified by a common trend assumption.

A complication with these studies is that it is not possible – in two-adult households – to separately identify a labeling effect of child benefit income from the alternative explanation that the increase in the share of total household income received by the mother (child benefit is almost always paid to the mother) leads to the change in spending patterns. That is, it could be who receives the money, rather than the label, that matters, and the potential labeling effect cannot be disentangled from a "recipiency" or intrahousehold effect. This issue of intrahousehold allocation may be particularly important in the case of spending on children. Among single-mother households, for whom these intrahousehold considerations are not relevant, Kooreman finds an effect in the direction consistent with labeling mattering. However, in his baseline specification the effect is not statistically different from zero at conventional levels. Similarly, Blow, Walker and Zhu find weaker results for single-parent households.

Turning to in-kind transfers, such as food stamps, while some researchers have claimed to find evidence contradicting standard economic theory, the studies with the most credible and convincing designs find the opposite. In particular, Moffitt (1989) and more recently Hoynes and Schanzenbach (2009) find no evidence that infra-marginal consumers treat food stamps differently than an equivalent cash payment.

In contrast, Abeler and Marklien (2010) have recently compared inkind grants and (unlabeled) cash grants in small laboratory and field experiments and find evidence against the fungibility of money in those contexts.<sup>3, 4, 5</sup>

The WFP, which we study, is a universal annual cash transfer paid to households containing an individual aged 60 or over. Its payment is unconditional – there is no obligation to spend any of it on household fuel. The payment during most of the period covered by our data was worth £250 to households where the oldest person is aged between 60 than 80 and £400 where the oldest person is 80 or over. The sharp age cut-off for receipt eligibility (the fact that all households where there is somebody aged 60 or older at the cut-off date qualify for the benefit, and no households where all members are younger than 60 qualify) presents an excellent opportunity to employ a regression discontinuity design to assess whether there is a labeling effect associated with the WFP. Relative to small laboratory or field experiments, studying the WFP has the advantage that the WFP is an actual transfer received by a large population. Relative to studies of the child benefit, the WFP offers very clean identification of a labeling effect through the regression discontinuity design. In our sample confounding by a possible intra-household effect is much less likely. This is because, to avoid concurrency of the onset of eligibility for the WFP and the female state pension, we exclude couples where the woman is the older partner and so, at the eligibility threshold, the WFP is received by the male. We also have sufficient sample size to test for effects in single person households.

The WFP delivers additional disposable income, but eligibility for the WFP, being based on age, is easily anticipated. Thus the additional disposable income may not lead to a change in total spending at the onset of eligibility. To the extent that the additional disposable income that the transfer delivers does lead to an increase in total expenditure,<sup>6</sup> we would expect this to be associated with an increase in spending on fuel (because fuel is a normal good) and a decrease in the fuel budget share (because fuel is a necessity), regardless of whether the transfer is labeled. This variation in fuel spending and budget share with total expenditure is the "income effect" of standard demand theory. To measure a labeling effect, we need to account for this possible income effect. Therefore, in our analysis we embed our regression discontinuity design within a consumer demand framework. To model standard income effects we estimate an Engel curve for fuel expenditure allowing for flexible effects of total expenditure on the fuel budget share, and to test for a labeling effect we augment this with smooth age effects on preferences and a discontinuity at age 60. This discontinuity captures the effect of payment of the WFP on share of total expenditure spent on fuel, holding total expenditure constant. The size of this shift is informative about the proportion of the WFP that is spent on fuel above and beyond what would be expected from the usual income effect (as measured by the slope of the Engel curve.)

We find statistically significant and robust evidence of a substantial labeling effect. We estimate that households spend an average of 47% of the WFP on household fuel. If the payment was treated in an equivalent manner to other increases in income we would expect households to spend only about 3% of the payment on fuel. We conduct a number of robustness and falsification tests. We carefully test - and reject - the possibility that this effect arises from non-separabilities between consumption and leisure: the effect we observe cannot be explained by retirements around age 60 altering the demand for heating fuel. Moreover, we find no effect in data drawn from the period before the WFP was introduced. In the program period we find a statistically significant effect for both singles and couples, confirming that this is not an intrahousehold allocation effect. Thus this dramatic difference in the marginal propensity to consume fuel out of the WFP is evidence that the name of the benefit (possibly combined with the fact that it is paid in November or December) has some persuasive influence on how it is spent.

Understanding the effect that labels have is important for public policy. If labeling cash or cash-equivalents influences how they are spent, then governments might use labels innovatively to increase consumption of particular goods or services that are thought to be underconsumed. Of course, if the aim of a particular transfer is not to increase spending on any particular good or service but rather to carry out a straightforward redistribution of resources then an operative label might actually imply a utility cost — and care should be taken in naming benefits.

This paper proceeds as follows. Section 2 gives a brief introduction to the Winter Fuel Payment and to the data that we use (the Living Costs and Food Survey). Section 3 outlines the empirical framework that we apply to identify the labeling effects, and our estimation methods. Section 4 presents graphical evidence and our estimates of the labeling effect. Section 5 provides further discussion of the estimates and Section 6 concludes.

<sup>&</sup>lt;sup>2</sup> This does not imply that parents disregard their children's welfare. The paper finds evidence that this spending effect comes from the unanticipated variation in child benefit, which suggests that parents are altruistic and insulate their children from income variation.

<sup>&</sup>lt;sup>3</sup> First Abeler and Marklein show in a field experiment in a restaurant that beverage vouchers increase beverage consumption by more than a general voucher towards their total bill. The difference is statistically significant and larger than what might plausibly be attributed to the small number of patrons for whom the transfers might be distortionary. They then show a similar effect with notional consumption of two goods in a laboratory experiment with students.

<sup>&</sup>lt;sup>4</sup> There is much better evidence that labeling of transfers between levels of government has an important effect on how the transferred funds are spent. This is called the "flypaper effect". See Hines and Thaler (1995).

<sup>&</sup>lt;sup>5</sup> Card and Ransom (2011) find large effects on voluntary supplemental savings contributions depending on the share of mandatory contributions to a defined contribution pension plan that is labeled an employee contribution rather than an employer contribution.

<sup>&</sup>lt;sup>6</sup> Research such as that by Parker et al. (2013) suggests that households only increase total spending on receipt of predictable transfers and not in anticipation of them.

<sup>&</sup>lt;sup>7</sup> Because labels do not impose constraints, this would be very much in the spirit of Thaler and Sunstein's (2008) "libertarian paternalism".

#### 2. Institutional background and data

#### 2.1. The Winter Fuel Payment

The WFP is a universal annual cash transfer paid to households containing an individual aged 60 or over. Eligibility is determined by age in the 'qualifying week' – recently, the third full week of September – of the relevant year. The payment is usually made in one lump sum in November or December and during most of the period covered by our data was worth £250 to households where the oldest person is aged between 60 than 80 and £400 where the oldest person is aged 80 or over (these values were reduced to £200 and £300 in the UK Budget of March 2011). The level of the payment is unaffected by the number of individuals in the household who are entitled to receive it — where both members of a couple are eligible for the WFP half of the amount is paid to each member.

The WFP was introduced in 1997 — though initially the payment was means-tested and of lesser value (£50) than currently. It took on its current form in 2000 — at which point the means-testing was dropped, age became the only eligibility condition attached to receipt and the level of the payment was increased. In all specifications (other than in our falsification tests) we use data from 2000 onwards only.

For individuals who already receive any one of a number of other state benefits there is no need to apply — payment is automatic. For others an application form must be completed. For recipients of other benefits, payment is made in the same manner as for those benefits. Recently, this is predominantly done by bank transfer although earlier in our sample period more would have received the payment by check. When the payment is made automatically recipients receive a notification letter in the mail detailing the level and timing of the payment. This may make the payment and its label very salient. For recipients of the benefit who must make an application payment is now by bank transfer though previously there was an option to receive a check instead. These recipients also receive mailed notification of the timing and level of the payment prior to it being lodged to their account.

The rate of take-up of the WFP is very high – it was above 90% in each year since 2003 – the first year our data allows us to estimate it. Benefit take-up is typically under-reported in surveys (see Brewer et al, 2008) so this is likely an underestimate.

#### 2.2. Data

The Living Costs and Food Survey (LCFS)<sup>9</sup> is the primary source of household-level expenditure data in the UK. It is a nationally representative annual survey with a sample size of approximately 6000 households. Surveys are conducted throughout the year. The survey consists of an interview and an expenditure diary. Each respondent is asked to keep a diary for a two-week period in which they record every purchase that they make. In addition, an expenditure questionnaire asks them to record recent purchases of more infrequently-bought items. The combination of the diary and questionnaire allows the construction of a comprehensive measure of household expenditure. In the case of fuel spending, most information comes from the questionnaire (for example last payment of electricity on account) although some comes from the diary (for example slot meter payments). The questionnaire is completed with the interviewer present, and respondents are asked to consult bills. Total spending on fuel includes gas and electricity payments, and the purchase of coal, coke and bottled gas for central heating. 10 Clearly some electricity and gas use may have been for cooking, lighting, etc. and not heating, but it is not possible to separate this out. In addition to these measures, the LCFS records detailed income, demographic and socio-economic information on respondent households.

In our main analysis, we pool data from the years 2000 through 2008. The nominal value of the WFP was fairly stable over this period, with the main rate (paid at age 60) varying between £200 and £250 per year. We also use a second tranche of data covering the years 1988 through 1996 to conduct a falsification test; these data predate the introduction of the WFP in 1997. We do not use data from the years 1997 through 1999 before the WFP took on its current form.

Additionally we exclude from our sample single women and couples where the woman is older. We do this as the age of eligibility for the state pension for women was 60 during the period covered by our data — the same age as for the WFP (the state pension age for men during this period was 65). This exclusion means that each household in our sample (i.e. single men and couples without children in which the male member of the couple is older) does not become eligible for the state pension and the WFP at the same time — an important consideration for our identification strategy. The group we study (single men, and couples in which the male partner is older) represents 52% of WFP eligible households, and 57% of eligible households in the age range (aged between 45 and 75) which we are to study. Fig. 1 plots the sample size in one-year bins over the relevant range.

In addition to the state pension, entitlement to which is based on work history, the UK has a means-tested payment known as Pension Credit (formerly known as the Minimum Income Guarantee). Eligibility for this payment is based on age (being payable at 60) and income. We discuss this further in Section 3.

Table 1 presents summary statistics for our sample divided between eligible households and households in which the oldest member is below the age cut-off. Eligible and ineligible households differ in important ways. However, the regression discontinuity design we describe below overcomes these differences by estimating an average treatment effect at the eligibility threshold. That is, our research design rests not on the similarity of eligible and ineligible households broadly, but on the similarity of those just above and below the eligibility cut-off.

For both eligible and ineligible households, we present summary statistics for the entire subsample, and for the poorest quartile of households as determined by household total expenditure (we define quartiles with respect to the entire population of households and not with respect to our estimation sample). Note that relative to the average, poorer households spend less on fuel absolutely, but spend a larger share of their budget on fuel. Fuel is a normal good, and a necessity. These facts are well-known, but they play an important role in our empirical design, which we turn to next.

### 3. Empirical framework and methods

Households where the eldest member turns 60 before the qualifying week are eligible for the WFP and households where the eldest member turns 60 after the qualifying week are not. This sharp eligibility criterion suggests estimating the effects of the WFP using a regression discontinuity design (RDD). Take up of the WFP is very high (over 90%), and so a research design based on the eligibility criterion can be considered a sharp RDD.

The intuition behind an RDD approach is straightforward: households immediately below the cut-off provide evidence on how households immediately above the cut-off would have behaved had they not received the transfer. The identifying assumption is that, in the absence of the transfer, expenditures vary continuously with the forcing variable, age, implying that, for the sample we consider, preferences and budget constraints evolve smoothly with age. Any discrete change at age 60 is thus attributable to the average effect of the WFP (at age

Strictly speaking the WFP is paid to households where anyone is over the female state pension age. This age was 60 for the entire period for which we have data. However, between April 2010 and April 2046 it is planned that eligibility will rise gradually to the age of 68.

age of 68.

<sup>9</sup> The LCFS was known as the Expenditure and Food Survey (EFS) between 2001 and 2007 and previous to that was known as the Family Expenditure Survey (FES).

<sup>&</sup>lt;sup>10</sup> As a part of the interview, respondents are encouraged to provide interviewers with pay slips, bank account statements, and gas and electricity bills (ONS 1991).

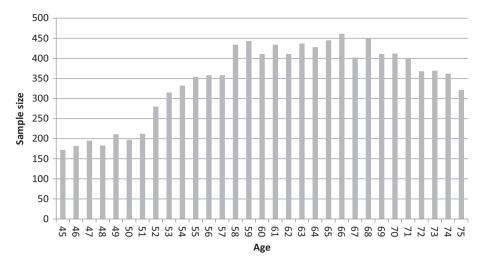


Fig. 1. Sample size by age.

**Table 1**Descriptive statistics — weekly means (£ and shares).

	Ages 45–59		WFP eligible		
	All	Poorest quartile	All	Poorest quartile	
Income	531.35	199.63	405.25	244.95	
Total expenditure	434.59	124.47	362.42	151.62	
Fuel	18.37	11.96	18.79	13.96	
Food	44.14	24.74	47.23	34.32	
Clothing	13.37	2.01	11.95	3.33	
Leisure goods	14.04	3.67	13.09	5.32	
Fuel share	0.046	0.084	0.055	0.081	
Food share	0.128	0.210	0.162	0.232	
Clothing share	0.033	0.018	0.036	0.025	
Leisure goods share	0.039	0.037	0.044	0.042	
Sample size	4423	760	6326	1746	

Notes: Living Costs and Food Survey (LCFS), 2000–2008. Single men and couples without children in which the male is older. The LCFS was known as the Expenditure and Food Survey (EFS) between 2001 and 2007 and previous to that was known as the Family Expenditure Survey (FES). The poorest quartile is defined by total expenditure and relative to the entire population of households (not just those in our estimation sample).

60).<sup>11</sup> Age has previously been used as the forcing variable in regression discontinuity designs. See for example: Edmonds et al. (2005), Card et al. (2008), Carpenter and Dobkin (2009) and Lee and McCrary (2009).

#### 3.1. Labeling effects in an Engel curve framework

As noted above, if households do not adjust spending until an anticipated benefit is received, receipt of WFP might lead to a change in fuel spending simply because of a standard income effect. In our analysis we need to distinguish a labeling effect from an income effect and to assess whether the WFP is allocated *differently* to how an unlabeled transfer would be allocated. Therefore, we embed a regression discontinuity design within an Engel curve framework. If households on either side of the eligibility criteria spend significantly different shares of expenditure on fuel, *holding total expenditure constant*, this would be direct evidence of a labeling effect.

In standard demand analysis, Engel curves measure the relationship between household spending on a good and total household expenditure as total expenditure increases. A common empirical specification of Engel curves relates budget shares to the logarithm of total expenditure. Fuel is a normal good so as the level of total expenditure rises we would expect fuel expenditure to rise. Because fuel is also a necessity, we would expect it to rise less quickly than total expenditure, and so the budget share should fall. These are standard income effects. Thus, an increase in fuel spending, or a decrease in the fuel budget share, with receipt of the WFP might simply represent a standard move along the Engel curve — i.e. an income effect; this is illustrated by the move from point A to point B in Fig. 2, where the Engel curve is presented in share form. In contrast, if there is a labeling effect, when a household receives a labeled transfer, they will shift off this Engel curve, as illustrated in Fig. 2 by the move from point B to point C.

To test for a labeling effect, while allowing for standard income effects, we estimate standard Engel curves, which relate budget shares to a function of total expenditure, combined with a regression discontinuity at age 60. We begin with a graphical analysis of age-specific non-parametric Engel curves. We then proceed to the RDD by estimating parametric Engel curves augmented by the forcing variable (age) and other controls.

There are several advantages to working with the share form of Engel curves. Extensive experience in modeling household demands has shown that working with shares significantly reduces heteroscedasticity, and that budget shares are well modeled by a low-order polynomial in the logarithm of total expenditure. In U.K. micro data the fuel share, in particular, is approximately linear in the logarithm of total expenditure (see for example Banks et al., 1997). A further advantage is that an unmeasured increase in income or other resources at age 60 would drive the share *down* (because fuel is a necessity) and so bias our framework against finding a labeling effect. However, as a robustness check, we also estimate our main model with fuel expenditures as the outcome variable of interest.

In our RDD estimates we allow preferences to evolve continuously with the forcing variable, age of the oldest household member,  $A_i$ , by including polynomials in age (we use a quadratic specification which minimizes Akaike's Information Criterion and the Bayesian Information Criterion). We augment this empirical specification with a dummy,  $D_i$ , for WFP eligibility. This variable captures any discontinuity in the way that budget shares vary with age, conditional on total expenditure (and other covariates). We attribute any such discontinuity to the effect of labeling the transfer. Eligibility is related to age by  $1[A_i \ge 60]$  where 1 [.] is the indicator function. As per Lee and Lemieux (2010), we interact  $(A_i - 60)$  and  $(A_i - 60)^2$  with program eligibility to allow the slope and curvature of the regression line to differ on either side of the eligibility cut-off. Finally, we include a number of covariates,  $Z_i$ , to increase the precision of the regression discontinuity estimator and to capture

<sup>&</sup>lt;sup>11</sup> In principle we could also search for an effect at age 80, at which point the WFP becomes more generous. However, in the LCFS age has been top-coded at 80 since 2002 which means that we are unable to implement the RDD around age 80.

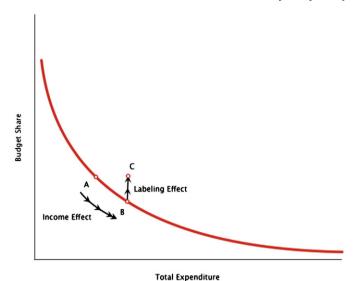


Fig. 2. Engel curve with income effect and labeling effect.

variation in relative prices. In all specifications, these include household size, month, area, and year. In all specifications we also interact area dummies, and total expenditure variables (capturing f(X)) with year dummies. In several specifications we also include employment (of head and, where relevant, spouse), housing tenure, number of rooms and education controls.

Hence, in complete form, our regression discontinuity Engel curve specification, using quadratic terms in age, can be written:

$$w_{ki} = \alpha + \tau D_i + \beta_1 (A_i - 60) + \beta_2 (A_i - 60)^2 + D_i \cdot \beta_3 (A_i - 60) + D_i \cdot \beta_4 (A_i - 60)^2 + \delta^T \cdot f(X_i) + \gamma^T Z_i + e_i$$
 (1)

where e is an independent (and possibly heteroscedastic) disturbance term and, the dependent variable is the budget share of good k, and  $\tau =$ 

$$\lim_{A\downarrow 60} E[w_k|A=60,Z=z,X=x] - \lim_{A\uparrow 60} E[w_k|A=60,Z=z,X=x] \text{ provides a local estimate of the effect of the WFP on budget shares at age 60, holding total expenditure constant. We estimate this model (and all subsequent models except where otherwise stated) using least squares and report robust standard errors.$$

This specification imposes that the labeling effect on the budget share, if any, is independent of the level of total expenditure. <sup>12</sup> We will test this specification below. <sup>13</sup>

In results presented below, we specify f(X) to be a quadratic function of the natural logarithm of total expenditure, but results are robust to more flexible specifications. Note that the total expenditure variables are also interacted with year dummies; within the constraints imposed by theory, we want to allow the form of the Engel curves we estimate to be quite general and so we allow the slope (as well as the intercept) of the Engel curve to change as relative prices change. This is important to ensure that the discontinuity effect we estimate is not picking up changes in the shape of the Engel curve over time that we have not allowed for.

We now turn to possible threats to the validity of this research design and how we deal with them.

#### 3.2. Measurement of age

The LCFS collects information on age in years at the time of interview but not date of birth. If we assume that households where the oldest member of the household is 60 receive the benefit then some misclassifications will occur. Recall that eligibility is determined according to age in the 'qualifying week' — which during the period covered by our data was in September. Consider then a household — interviewed, for example, on January 1st who reports that the oldest member of the household is 60. If that person were born in January through to the qualifying week in September of the previous year, they would be eligible for the WFP, whereas if they were born after the qualify week (roughly October through to January), they would not. Thus the probability that this household is eligible is about eight twelfths. A household interviewed in February with the oldest member age 60 has a lower probability of being eligible. A household interviewed in December with the oldest member age 60 has a higher probability of being eligible. If birth dates and interview dates are distributed evenly throughout the year, the average probability that a household with the oldest member age 60 (at the interview date) is WFP eligible is one half. In our sample, the distribution of interview dates (which we do observe) suggests a slightly higher probability of about 52%, again assuming that birth dates (which we do not observe) are evenly distributed through the vear.

In spite of this, in what follows we classify households where the oldest member of the household is 60 as receiving the WFP. If the benefit has a positive labeling effect on fuel budget shares, our approach will bias downward the estimates of that effect (by misclassifying some untreated households as treated) and so yield a conservative estimate. As we are misclassifying approximately half of 60 year olds, the true effect for those of that age will approach twice the impact that we find. There is no misclassification of eligibility among households where the oldest member is 61 or older. We investigate the robustness of our approach by re-estimating the labeling effect on a sample that omits households in which the oldest individual reports an age of 60. This alternative strategy should not suffer from attenuation bias, but it estimates the effect of the WFP on 61 year olds, rather than 60 year olds.

#### 3.3. Measurement error in total expenditure

One possible concern is that measurement error in household expenditure could bias our estimate of the effect of WFP. In general, measurement error in one variable can potentially bias the estimate of all regression coefficients. In a simple example with classical measurement error where the only regressors are log expenditure and WFP receipt, the bias on the WFP coefficient would have the same sign as the relationship between log expenditure and the fuel share, which is negative, and so the bias would actually be downwards (against finding a labeling effect — this is, again, a benefit of working with the share form of Engel curves). However, we cannot be sure that this would be the case in our more complicated specification. Therefore, as a check, we follow standard practice in demand analysis and instrument total expenditure with household income.

# 3.4. Employment effects

From 1988 onwards individuals aged 60 or over have been entitled to a benefit, the name and exact details of which have changed, but which is essentially a pensioner minimum income guarantee (i.e. a minimum income guarantee without obligation to seek work). From 1988 to 1999 this was called Pensioner Income Support, from 1999 to 2003 it was known as the Minimum Income Guarantee, and in 2003 this was replaced with Pension Credit. For the rest of this paper we will refer to this benefit as the Minimum Income Guarantee (MIG). Therefore, note that we do not have a period where age 60 brings only

 $<sup>^{12}</sup>$  Of course, this specification implies that the effect, if any, on pounds of fuel expenditure varies with the level of total expenditure.

<sup>&</sup>lt;sup>13</sup> In Beatty et al. (2011) we lay out a more general specification that nests Eq. (1).

eligibility for WFP; from 1988 to 1996 we have the MIG alone and from 1997 to 2008 we have the MIG plus WFP.  $^{14}$ 

While we would not expect the MIG to have a labeling effect, it might have a labor market participation effect, and, if consumption is not separable from leisure, this in turn will have an effect on spending patterns. Specifically, when a working individual turns 60, they become entitled to the MIG and they might prefer stopping work and receiving the MIG to carrying on in employment. But dropping out of the labor market might influence spending patterns; someone who is now at home for more of the day might heat their home more and therefore have higher fuel spending. While the analysis in Blundell et al. (2011) indicates that there is no evident discontinuity in male labor supply (at either the extensive or intensive margin) at age 60,<sup>15</sup> among our specification tests we include employment and self-employment dummies and hours of work for both the head of household and (where there is one) the spouse.

It might be that controlling for observable labor market status in this way is enough to deal with this (potential) issue. However, using 1988–1996 as a falsification test allows an additional check on whether our results are contaminated by the labor market effect of the MIG. Estimating an RDD on a pre-program period as a falsification test is normally good practice (see, for example Lemieux and Milligan (2008)), but here it is particularly important because the potential confounding of the WFP effect by the MIG. A significant effect in these data would falsify the assumption that preferences evolve continuously with age.

## 3.5. Distinguishing labeling from intra-household allocation effects

We noted above that in investigations of labeling and child benefit payments it is difficult, in two-parent households, to distinguish a labeling effect from an effect induced by the payment increasing the bargaining power of the woman. The WFP differs from child benefit in that there is no compelling reason to believe that its effect on spending patterns works through the intrahousehold distribution of income receipt. First, as noted above, there is reason to think that the intrahousehold distribution of income receipt is particularly important in the case of spending on children. In contrast, there is no obvious reason to think that the intrahousehold distribution of income receipt is particularly important for spending on fuel by older households. Second, in the sample of couples we have selected the male member is always older. Thus at the eligibility threshold for WFP, only the male is eligible and when only one member of a household is eligible for WFP, the transfer is paid to that member. This means that, when implemented on our sample of couples in which the husband is older, our regression discontinuity design studies the effect of a labeled transfer to husbands. In the birth cohorts we study husbands were the primary earners and it is implausible that this £250 transfer had a significant effect on the influence those husbands had over household spending patterns. Finally, as a robustness check we implement our analysis separately for singles and couples.

# 3.6. Additional robustness checks and falsification tests

Regression discontinuity designs can be sensitive to the choice of the range of the forcing variable included in the regression, here the age of the oldest household member. Our basic specification uses a window of fifteen years on either side of the discontinuity (45–75). As a robustness check we re-estimate with a window of ten years on either side of the discontinuity (50–70) and using the Imbens and Kalyanaraman (2012) optimal bandwidth in a local linear regression discontinuity design framework.

We also repeat our analysis in levels of expenditure, rather than budget shares. Although levels of expenditure are noisier, and more heteroscedastic than shares, this provides a direct estimated of the impact on fuel spending.

Finally, we conduct a further falsification test. We rerun our main analysis but with cut-offs at 55 and 65 rather than 60. Under the maintained assumptions of the regression discontinuity design we should not find discontinuities (in levels or shares) at these age cut-offs.

#### 4. Results

#### 4.1. Graphical evidence

As suggested by Lee and Lemieux (2010), we begin with a straightforward graphical presentation. Fig. 3 plots the average fuel expenditure share in one-year age bins, over the range 45–75, with a locally-weighted regression line overlaid on either side of the eligibility threshold for the WFP. The top panel uses data from 2000 to 2008, when the WFP was in effect. The bottom panel uses data from 1988 to 1996, prior to the introduction of the WFP. The fuel share appears to change smoothly over time, with a fairly clear jump of roughly one percentage point at age 60 in the period during which the WFP was paid. This jump is not evident in the earlier period.

These figures show average fuel budget shares by age, but not the relationship between fuel budget and total expenditure by age - that is the Engel curves that are central to our empirical approach. Fig. 4 presents age-specific nonparametric fuel-share Engel curves estimated on our data. As with Fig. 3, the top panel uses data from 2000 to 2008, while the bottom panel uses the pre-policy period. These fuel Engel curves were estimated by local polynomial regression of the fuel share on age and log total expenditure, with weights based on with a bivariate normal kernel. The Engel curves at ages 57, 58 and 59 use data on the WFP-ineligible population (under age 60) only, while the Engel curves at ages 60, 61 and 62 use data on the WFP-eligible population (age 60 and over) only (noting, as explained before, that some of the 60 year olds may actually not be eligible, making our analysis stricter than it should be). The striking feature of Fig. 4 is that in the WFP period there is a distinct jump in the Engel curve between ages 59 and 60. At every level of total expenditure, 60-year olds spend more on fuel than 59 year olds. Preferences for fuel appear to evolve smoothly at other ages. This "jump" in the Engel curve is consistent with an effect of labeling the WFP, as described in Fig. 2. Moreover, the shift between the age 59 and age 60 Engel curves is *not* present in the data drawn from before the introduction of the WFP, and so is not an artifact of the estimation method, nor a consequence of any aspect of turning 60 that existed prior to 1996.

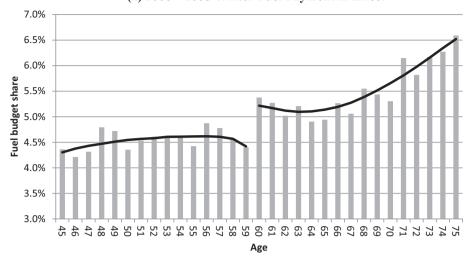
# 4.2. RDD estimates of the labeling effect

Table 2 shows the results of our parametric Engel curve estimation. The first column of the table, specification 1, gives our baseline results. We find a positive, statistically significant discontinuity effect for the fuel share and no significant effect for any other good. The coefficient is 0.0069 implying that the payment of the Winter Fuel Payment increases fuel budget shares by nearly seven tenths of a percentage point. The average fuel share of those aged 45 to 59 is 4.6%, so this is a

<sup>&</sup>lt;sup>14</sup> The means testing of housing and council tax benefit associated with the MIG became more generous part way through our policy period, in 2003. Thus after 2003, turning 60 was associated with somewhat larger transfers for some. However, we condition on total expenditure, which should capture variation in resources, and, as argued above, additional resources that we fail to control for should lead to lower, rather than higher fuel shares. Widespread travel discounts and free off-peak travel in London significantly predate the introduction of WFP, but free off-peak travel outside London was introduced in 2006. The substitution effect of a lower price of going out should be less time at home (and hence perhaps lower fuel shares); the income effect should also lower the share of necessities like fuel.

<sup>&</sup>lt;sup>15</sup> While there is a discontinuity in female labor supply at 60 (the age of eligibility for the state pension for women), recall from Section 2 that we exclude from the sample single women and couples where the woman is older. As a result no household in our sample first receives the state pension and WFP at the same time — and our identification strategy is unaffected by discontinuities in female labor supply at age 60.

## (a) 2000 - 2008 Winter Fuel Payment in Effect



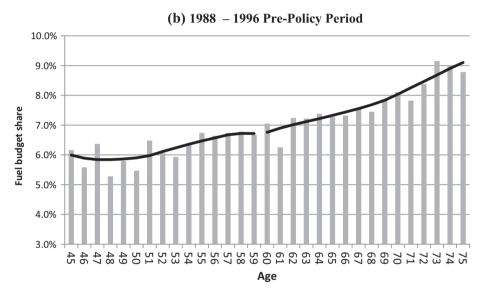


Fig. 3. Fuel budget shares by age. 2000–2008 Winter Fuel Payment in effect. 1988–1996 pre-policy period.

substantial increase in spending on fuel. We interpret this effect on the fuel share, holding total expenditure constant, as a labeling effect. <sup>16</sup> Recall that this estimate understates the full effect for those aged 60 because our approach misclassifies some of those who do not receive the benefit as receiving it (those who have reached age 60 when surveyed but had not done so at the preceding eligibility cutoff date).

We find no statistically significant effects on the share spent on food, clothing and leisure goods. <sup>17</sup> We also report estimates for total expenditure. While total expenditure is lower for eligibles than for non-eligibles (see Table 1) there is no evidence of a discontinuity at age 60. This

affirms that the changes in shares reported in the rows above reflect changes in the pattern of expenditures.

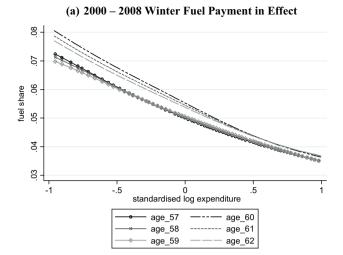
In column (2) we add additional control variables for education, employment, housing tenure and number of rooms in the home. The positive effect on the fuel share is robust to the inclusion of these additional controls. In column (3) we instrument for total expenditure with household income to account for the possibility of measurement error in total expenditure. This has almost no impact on the estimated labeling effect. Although our quadratic age polynomial used in each of these three specifications was chosen to minimize Akaike's Information Criterion, we experimented with higher order polynomials and found that our results were entirely robust to variations in the specification of the age variables. These results are not reported in the table but are available on request.

These regressions control for the total level of expenditure. The coefficient for the base year on total expenditure in these regressions lies between -0.032 and -0.035 (these are not reported in the tables).

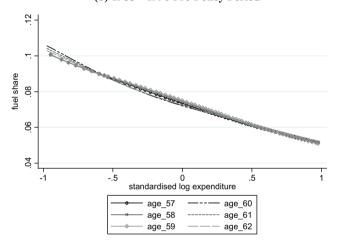
<sup>&</sup>lt;sup>16</sup> The standard errors reported in the linear regressions here are robust to heteroscedasticity. We have also examined the results obtained using one-way clustering on both age and year. In both cases, we find smaller standard errors on the coefficient indicating the discontinuity. In presenting the results therefore, we have, conservatively, chosen the standard errors that result in the least likelihood of finding significant results. We have also tested the results obtained using two-way clustering on age and year using the method suggested by Cameron et al. (2011). The variance covariance matrix in this case is not of full rank. In such a situation Cameron et al. (2011) suggest setting the negative eigenvalues of that matrix to zero. When we proceed in this manner, the statistically significant effect of the winter fuel payment on fuel budget share remains.

 $<sup>^{17}</sup>$  Of course, the budget constraint implies that the positive effect on fuel spending must be offset by reductions elsewhere, though the offset could be spread over many goods and hence difficult to detect.

<sup>&</sup>lt;sup>18</sup> To illustrate the strength of the instrument we have estimated regressions of the logarithm of total expenditure on the logarithm of current income year by year. The smallest t-statistic we find on income is 12.05 and smallest coefficient on log income (the elasticity) is 0.36.







**Fig. 4.** Fuel Engel curves by age. 2000–2008 Winter Fuel Payment in effect. 1988–1996 pre-policy period. Notes: Fuel Engel curves estimated by local polynomial regression of the fuel share on age and log total expenditure, with weights based on with a bivariate normal kernel (with age and log total expenditure as arguments). This allows the fuel share to vary in a general way with age and log total expenditure. The Engel curves at ages 57, 58 and 59 use data on the WFP-ineligible population (under age 60) only, while the Engel curves at ages 60, 61 and 62 use data on the WFP-eligible population (over age 60 and over) only.

That the fuel share falls with total expenditure confirms that well-known fact that fuel spending is a necessity, as noted above.

Column (4) of Table 2 shows the results from the implementation of the local linear regression discontinuity estimator and applies the optimal bandwidth of Imbens and Kalyanaraman (2012). <sup>19</sup> In each case the optimal bandwidth is close to 1 year. Identification here, then, comes from comparing households located immediately on each side of the threshold. Applying this estimator yields a larger point estimate than that found using our baseline specification.

Table 3 shows the results of four additional robustness checks. Column (1) takes the baseline specification augmented with additional controls and narrows the age window to 10 years on either side of age 60. Column (2) implements the local linear regression discontinuity design estimator with double the optimal bandwidth (i.e. uses a bandwidth of 2 years). The estimated effect on fuel budget share of WFP receipt in each of these cases is positive, significant and of a similar magnitude to our baseline estimate. Column (3) drops those aged 60 – some of whom will be classified as having received the WFP when they have

**Table 2**RDD estimates. Effects of WFP on budget shares (conditional on total expenditure) and on total expenditure.

Shares	(1) OLS	(2) OLS	(3) IV	(4) Local linear
Fuel	0.0069***	0.0068***	0.0067***	0.0083**
	(0.0019)	(0.0019)	(0.0019)	(0.0026)
Food	0.0007	0.0006	0.0008	0.0025
	(0.0036)	(0.0036)	(0.0036)	(0.0045)
Clothing	-0.0008	-0.0011	-0.0011	-0.0052
	(0.0030)	(0.0030)	(0.0030)	(0.0043)
Leisure goods	0.0014	0.0011	0.0012	0.0020
	(0.0029)	(0.0028)	(0.0029)	(0.0037)
Total expenditure	0.0170	0.0098		0.0265
	(0.0321)	(0.0279)		(0.0346)
Age window	45-75	45-75	45-75	59-60 (optimal)
Number of observations	10,749	10,749	10,749	854
Data period	2000-2008	2000-2008	2000-2008	2000-2008
Additional controls		Y	Y	Y

#### Notes

- 1. The base specification for the share regressions contains the following controls: (the natural logarithm of) total expenditure and its square; year dummies, region dummies and their interactions; interactions between the year dummies and the total expenditure variables; month dummies; and (the natural logarithm of) household size. The additional controls are employment, self-employment and hours (of the head, and where relevant, the spouse), housing tenure, number of rooms and education controls. The results on total expenditure include the same controls (with the exception of total expenditure itself).
- 2. The age window pertains to the oldest person in the household.
- 3. Robust standard errors are given in parentheses.
  - † Significant at 10% level.
- \* Significant at 5% level.
- \*\* Significant at 1% level.
- \*\*\* Significant at 0.1% level.

not – so that the comparison is between 59 and 61 year olds. In this case the coefficient falls slightly, despite the fact that this comparison does not suffer from the attenuation effect arising from the misclassification of 60 year olds. This suggests that the labeling effect of the WFP is strongest when first received, and then diminishes. In fact, this pattern is also apparent in Fig. 3. In the pre-policy period, the fuel budget share rises gently with age (bottom panel). The Winter Fuel Payment appears to bring forward and accelerate this shift in spending (top panel).

The fourth column of Table 3 reports the results from a regression of the *levels* of fuel expenditure rather than shares. The estimate here is also positive and statistically significant. The point estimate indicates that the payment of the WFP (of £250) induces additional expenditure of over £75 annually on fuel.

Table 4 presents the results of our falsification tests. In column (1) we report estimates of a discontinuity at age 60 in the period before the WFP was introduced (1988–1996). This is effectively an omnibus test of many possible mis-specifications that might affect the validity of our research design. If the positive effects of eligibility on fuel spending documented in Table 2 are driven by any misspecification or omitted factor that pre-dated the introduction of the policy, we should find evidence of that here. In particular, if the results are driven by differences in labor-supply (and consequent differences in household technology) then we should find an effect in this 1988–1996 falsification period in which the incentives for a retirement around age 60 (including the MIG) were broadly the same.

<sup>&</sup>lt;sup>19</sup> This is estimated using the Stata package of Nichols (2011).

<sup>&</sup>lt;sup>20</sup> In an earlier version of the paper we report the results of estimating a "differenced-RDD" specification on pooled data from 1988 to 1996 and 2000–2008. This is therefore the average effect of the WFP on budget shares at age 60, conditional on total expenditure and net of any employment effect at age 60. The point estimate for this "differenced-RDD" specification was larger than our estimates in Table 2. This is because, as we see in our falsification test (Table 4), in the placebo period (1988 to 1986) the estimated coefficient on the eligibility dummy (age 60 and above) is negative (though not statistically different from zero.) The differenced-RDD estimate is less precisely estimated than the estimates in Table 2, but is still significant at the 5% level. Full details are available on request.

Table 3
Robustness checks.

	(1) OLS (2) Local linear		(3) OLS	(4) OLS	
Dependent variable	Budget share	Budget share	Budget share	Expenditure level	
Effect of WFP on annual fuel spending	0.0079***	0.0094**	0.0060**	75.44 <sup>*</sup>	
	(0.0023)	(0.0039)	(0.0021)	(36.44)	
Age window	50-70	2*Opt.	45–75	45-75	
Data period	2000-2008	2000–2008	2000-2008	2000-2008	
Number of observations	7985	1722	10,338	10,749	
Additional controls	Y	Y	Y	Y	
Robustness check	Smaller age window	Twice optimal bw (ages 58-61)	Dropping age 60	Levels	

#### Notes:

- 1. The base specification includes the following controls: (the natural logarithm of) total expenditure and its square; year dummies, region dummies and their interactions; interactions between the year dummies and the total expenditure variables; month dummies; and (the natural logarithm of) household size. The additional controls are employment, self-employment and hours (of the head, and where relevant, the spouse), housing tenure, number of rooms and education controls.
- 2. The age window pertains to the oldest person in the household.
- 3. Robust standard errors are given in parentheses.
- † Significant at 10% level.
- \* Significant at 5% level.
- \*\* Significant at 1% level.
- \*\*\* Significant at 0.1% level.

**Table 4**Falsification tests. Effects on fuel budget share (conditional on total expenditure).

Shares	(1) OLS	(2) OLS	(3) OLS	
	Prior to policy introduction	Discontinuity at 55	Discontinuity at 65	
Fuel	-0.0018	0.0027	-0.0014	
	(0.0021)	(0.0025)	(0.0019)	
Age window	45–75	45-75 <sup>6</sup>	45-75 <sup>6</sup>	
Number of observations	10,614	10,749	10,749	
Data period	1988-1996	2000-2008	2000-2008	
Additional controls	Y	Y	Y	

#### Notes:

- 1. The base specification includes the following controls: (the natural logarithm of) total expenditure and its square; year dummies, region dummies and their interactions; interactions between the year dummies and the total expenditure variables; month dummies; and (the natural logarithm of) household size. The additional controls are employment, self-employment and hours (of the head, and where relevant, the spouse), housing tenure, number of rooms and education controls.
- 2. The age window pertains to the oldest person in the household.
- 3. Robust standard errors are given in parentheses.
- 4. Rebalancing the sample (for example changing the age window around 55 to be 40-70) also yields insignificant results.
- † Significant at 10% level.
- \* Significant at 5% level.
- \*\* Significant at 1% level.
- \*\*\* Significant at 0.1% level.

As column (1) of Table 4 reports, we find no discontinuity in fuel spending at age 60 in the 1988–1996 pre-policy period. In fact, the coefficient on the age 60 dummy is *negative*, although it is not statistically different from zero.

Columns (2) and (3) of Table 5 report tests for discontinuities in the relationship between age and fuel budget share at ages 55 and 65, five years before and after eligibility for the WFP. Note that the latter (age 65) is the focal retirement age in the UK. As with the pre-policy period, we find no effect. Thus we are unable to find any evidence that contradicts the assumptions of RDD design.

Our basic specification imposes that the labeling effect on budget shares, if present, is unrelated to the level of total expenditure and to any other variable. In Table 5 we report the results of relaxing this assumption and allowing the effect to vary by quartile of total expenditure, by season, and by household type. Mostly the coefficients are not precisely estimated, which is to be expected given the now much smaller sample sizes. We can only marginally reject at the 10% level the hypothesis that there are no differences between expenditure quartiles — with a larger effect for poorer households, and we cannot reject nulls of no differences between groups defined by season and household types. In interpreting the absence of any significant difference between the seasons, it should be kept in mind that over half of all households pay for their fuel using equal installment plan (see Beatty et al.

(2014) for more details) and so additional consumption of fuel in winter will therefore result in increased spending on fuel throughout the year.<sup>21</sup>

We discussed in Section 3 the reasons for which we think it implausible that the results we find come from an intrahousehold effect rather than from a labeling effect. Despite these considerations discussed there, it is reassuring to see, in column (3), that the labeling effect is still significant when we split our sample into single men and couples. This confirms that the effect we find is indeed a labeling effect and not, instead, an intra-household effect. The point estimate for single men is larger than for couples (although, as stated, not significantly different from each other) but, again, the average total expenditure of this sample of single men is much lower than the couples' sample.

To summarize, we find a positive effect of WFP eligibility on the budget share of fuel, conditional on total expenditure and allowing preferences to evolve with age in a continuous fashion. The effect is strongly statistically significant and robust across alternative specifications.

<sup>&</sup>lt;sup>21</sup> As noted above some 60 year olds are mis-classified as treated when they are not. This will vary by season and so it is possible that our estimates of effects by season are biased by this. However, we have re-estimated these interactions dropping the 60 year olds (following the robustness check in column (3) of Table 3. When we do so, we are still unable to reject a common effect across all seasons.

**Table 5**RDD estimates for different sub-groups. Effects of WFP on budget shares (conditional on total expenditure).

	(1) Expenditure quartile:		(2) Season:	(2) Season:		(3) Household type:	
	1st	0.0205**	Winter	0.0085 <sup>†</sup>	Single man	0.0105*	
		(0.0077)		(0.0044)	_	(0.0048)	
	2nd	0.0066 <sup>†</sup>	Spring	0.0074 <sup>†</sup>	Couple	0.0048**	
		(0.0035)		(0.0038)	•	(0.0019)	
	3rd	0.0022	Summer	0.0083*			
		(0.0025)		(0.0035)			
	4th	0.0019	Autumn	0.0042			
		(0.0021)		(0.0036)			
F-test (p-value)		F(3,10129) = 2.16(0.09)		F(3,10165) = 0.29(0.83)		F(1,10433) = 1.23(0.27)	
Age window		45-75		45-75		45–75	
No. obs.		10,749		10,749		10,749	
Data period		2000-2008		2000-2008		2000-2008	
Add. conts.		Y		Y		Y	

#### Notes:

- † Significant at 10% level.
- \* Significant at 5% level.
- \*\* Significant at 1% level.
- \*\*\* Significant at 0.1% level.

Because of the very high take-up of this transfer among eligible households, the effect of eligibility is for all intents and purposes also the effect of receipt. We attribute this effect to the labeling of this transfer. A series of falsification tests failed to contradict our identifying assumptions, and in particular, we find no evidence of a confounding of the labeling effect with employment effects around age 60.

#### 5. Discussion

#### 5.1. Price effects

One further threat to our analysis is the idea that over-60 households pay lower prices for fuel. Note that given the results of our falsification tests, it would have to be the case that this was only true after 1996. There is no government policy of lower fuel prices for seniors of which we are aware. It is true that various charitable service organizations provide advice to seniors on how to find the best energy tariffs, and it is possible that such organizations are more active in recent years than previously. However, empirical estimates show that fuel demands are price *inelastic* (again see Banks et al., 1997 as an example). This means that lower prices would lead to lower, rather than higher, fuel shares.

## 5.2. Reporting effects

Our spending data are from surveys, raising the possibility that receipt of the Winter Fuel Payments changes reports of fuel spending rather than fuel spending itself. However, as noted above, most of the fuel spending information comes from the questionnaire which is completed with the interviewer present, and respondents are asked to consult bills and report the value of their last payment. Thus an effect on reporting behavior is unlikely.

# 5.3. Magnitudes

We can translate the magnitudes in Table 2 into spending changes as follows. Ignoring other covariates for simplicity, if

$$w_k = \frac{x_k}{X} = f(x)$$

then

$$\frac{\partial x_k}{\partial X} = \frac{\partial w_k}{\partial X} X + w_k$$

so if households receive a transfer of *wfp* then the slide along the Engel curve starting from total budget *X* (the move from A to B in Fig. 2) is approximately

$$\left(\frac{\partial w_k}{\partial X}X + w_k\right)$$
 wfp

and if our estimate of the movement off the Engel curve measured in percentage points of budget share (the move from B to C in Fig. 2) is  $\tau$  then the estimate of the labeling effect measured in pounds of expenditure is approximately

$$\tau(X + wfp). \tag{2}$$

With the results from, say, specification 2 in Table 2 our estimate of the slide along the Engel curve for someone with the average fuel share in 2008 of 0.0613 and total budget of around £308 per week receiving a transfer of £250 a year (so just under £5 a week) is £0.128 with a standard error of 0.010 and a 95% confidence interval around this point estimate of £0.108 to £0.148. Our estimate of the labeling effect is £2.13 with a standard error of 0.592 and 95% confidence interval of £0.97 to £3.29. In other words, if there was no labeling effect an average household would spend around 3% of a small transfer on fuel. We estimate an additional labeling effect of 44% (with a confidence interval of 20% to 68%) so that the overall marginal propensity to spend on fuel associated with the WFP is around 47%. Again note that it is a conservative estimate of the effect for those aged 60 (because household members who are 60 at the interview date, but did not turn 60 before the eligibility cutoff result in some mis-measurement of eligibility), and that, on the other hand, the data suggest that the effect is largest at age 60.

Eq. (2) shows that the absolute labeling effect depends on the estimated size of the discontinuity and on total household expenditure. Therefore, the different shifts estimated by expenditure quartile translate into point estimates of additional labeling effects of £2.81, £1.73, £0.91 and £1.38 respectively.

<sup>1.</sup> The base specification includes the following controls: (the natural logarithm of) total expenditure and its square; year dummies, region dummies and their interactions; interactions between the year dummies and the total expenditure variables; month dummies; and (the natural logarithm of) household size. The additional controls are employment, self-employment and hours (of the head, and where relevant, the spouse), housing tenure, number of rooms and education controls.

<sup>2.</sup> The age window pertains to the oldest person in the household.

<sup>3.</sup> Robust standard errors are given in parentheses.

### 6. Conclusion

This paper asks whether labeling an unconditional cash transfer has any effect on the way in which recipients spend it. In other words, does calling the £250 that most elderly households in the UK receive in November/December a "Winter Fuel" payment make any difference? Sharp differences in the eligibility requirements allow us to use a regression discontinuity design to examine how fuel expenditure changes on receipt of the benefit. We find a substantial and robust labeling effect. Our estimate of the (average) marginal propensity to spend on household fuel out of unlabeled income is approximately 3%. On average, we find that recipient households exhibit an additional marginal propensity to spend on household fuel out of the WFP of between about 20% and 68%, and so the combined effect is between 23% and 71%. The data also suggest that the labeling effect of the WFP is strongest when first received, and then diminishes.

The direct interpretation of this is straightforward: if households are given an unconditional and neutrally-named cash transfer of £100 they would be expected to spend approximately £3 on household fuel. If they are given an unconditional cash transfer called the Winter Fuel Payment in the middle of winter we estimate that they will spend between £23 and £71 on fuel (our point estimate is £47). Overall, our evidence implies that the label of this particular transfer has a critical impact on the behavioral response of those who receive it.

Labeling effects have been reported for child benefits but are not robustly replicated in different countries and, where they have been found, are not robustly distinguished from an intrahousehold effect. The other large transfer program with labeling that has been extensively studied is food stamps (in the U.S.). The best quasi-experimental studies of food stamps do not find any framing or labeling effect; infra-marginal consumers treat food stamps as a cash transfer, as standard economic theory would predict. Thus our findings are at odds with most of the existing literature. Our findings are for a large labeled transfer that has not been studied before and are based on a different identification strategy (the regression discontinuity design) than the prior literature. We also go beyond those papers that have found labeling effects in an important way by robustly ruling out an intrahousehold effect as an explanation for the differential spending of the transfer.

An unresolved challenge is to understand the mechanism behind this large effect. As noted in the Introduction section, a possibility is that it is a result of mental accounting, though it is unclear why such a mechanism would operate for WFP in the U.K. but not for food stamps in the U.S. An alternative explanation is that elderly people in the U.K. take the labeling of the WFP as health advice, about the importance of staying warm, from a credible source (the government). Food stamps might not be interpreted in the same way. This is not a full explanation as governments offer a wide range of health advice to their populations, some of which is followed and some of which is ignored. Resolving the detailed mechanism at work when a government labels transfers will require further research, with greater variation in details of the labeling and in the contexts in which it occurs.

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