

Subsidising rice and sugar? The Public Distribution System and Nutritional Outcomes in Andhra Pradesh, India

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Abbreviations:

AP	Andhra Pradesh
BMI	Body-Mass-Index
CES	Consumer Expenditure Survey
FNS	Food and Nutrition Security
HAZ	Height-for-age z-score
NSSO	National Sample Survey Organization
PDS	Public Distribution System
PSMM	Propensity Score Matching Method
TE	Treatment Effect
YL	Young Lives

Acknowledgements

No authors have any conflicts of interest to declare. Support for this project was provided by a grant from the Economic and Social Research Council, NWO-WOTRO, Population Reference Bureau, and Population, Reproductive Health, and Economic Development, and the RCN foundation joint research scheme. JB was partially funded by the Evangelisches Studienwerk e.V. Villigst through a basic scholarship. DS was funded by a Wellcome Trust Investigator Award. The funders had no role in the study design, data analysis, decision to publish, or preparation of the manuscript.

Keywords: Public distribution system; nutrition; food aid; India; child health; rice; sugar; stunting; height-for-age

Abstract

India's main food and nutrition security programme, the Public Distribution System (PDS), provides subsidized rice and sugar to deprived households. Using longitudinal data from Young Lives for Indian children (n=2,944) aged 5 to 16 years, we assessed whether PDS subsidies skewed diets towards sugar and rice consumption, increasing risk of stunting (low height-for-age). Linear regression models were used to quantify additional rice and sugar consumption associated with accessing the PDS, and the association with stunting linked to consumption. Controlling for sociodemographics, accessing the PDS was positively, significantly associated with consumption of rice (30g/day) and sugar (7.05g/day). There was no evidence that this increase corresponded to nutritional improvements. Each 100g increase in daily rice intake was associated with a lower height-for-age z-score (HAZ) and no decline in stunting. Results were robust to alternative model specifications. There was no evidence that receipt of PDS rice and sugar was associated with improvements in child nutrition.

Introduction

India is experiencing a double burden of malnutrition (Drèze and Sen, 2013; Ramachandran, 2006; Subramanian *et al.*, 2007). One-third (31%) of under-nourished children worldwide live in India (Development Initiatives, 2018). In 2015, 38.4% of Indian children under age 5 were stunted, and 58.6% of pre-school aged children suffered from anaemia (IIPS, 2017). Over 820 million people globally experience food insecurity (FAO *et al.*, 2019), with 1 in 9 of these living in India (FAO, 2014). Recent estimates suggest less than 10% of India children aged 6-23 months receive an adequate diet, and India is in the bottom 20 countries globally ranked by Global Hunger Index score (von Grebmer *et al.*, 2019). Previous research has linked undernutrition and food insecurityⁱ to diminished cognition (Crookston *et al.*, 2011; Sandjaja *et al.*, 2013), poorer learning outcomes (Aurino *et al.*, 2019; Crookston *et al.*, 2011), limited social skills (Jyoti *et al.*, 2005), and mortality (Black *et al.*, 2008; Christian, 2010; Fledderjohann *et al.*, 2014, 2016).

Meanwhile, the prevalence of insulin resistance is escalating due to overweight and obesity (Ramachandran, 2006), initially concentrated in urban areas and among children from higher socioeconomic backgrounds (Wang, Youfa *et al.*, 2009), but increasingly incident in low- and middle-income groups (Vellakkal *et al.*, 2013). Overweight and obesity have likewise been linked to negative outcomes such as stigma (Pont *et al.*, 2017) and poorer physical health (Davidson *et al.*, 2014) in a variety of contexts.

In addition to the considerable impacts on well-being, malnutrition has long-term implications for economic development. Taken together, the economic burden of malnutrition in India is estimated to be between 0.8 and 2.5% of the GDP (Crosby *et al.*, 2013), with long-term implications for the intergenerational transmission of poverty. Notably, however, extant

research demonstrates that malnutrition and food insecurity are not exclusively problems of poverty, neither in India (Aurino *et al.*, 2019) nor elsewhere (Garratt, 2019).

Ensuring the Right to Food

In response to high rates of undernutrition, the Government of India passed the landmark National Food Security Act in 2013 (Pillay and Kumar, 2019). While several governmental programmes targeting malnutrition have been in place in India for decades, the Act establishes the schemes as legal entitlements. This action is in contrast to the recent, much-criticized approach in many high-income countries (e.g. Great Britain), where food insecurity is framed as an individual problem rather than a structural issue, and charitable organizations are left to fill the gap (Garratt, 2019; Lambie-Mumford, 2013; Loopstra *et al.*, 2018). India's framing of food security as an entitlement is in principle consistent with the right to food established in Article 25 of the UN Declaration of Human Rights (United Nations, 1948) and the International Covenant on Economic, Social and Cultural Rights (OHCHR, n.d.). Within this framework, states have an obligation to prevent hunger, provide food where citizens are unable to do so for themselves due to structural constraints, and facilitate citizens' access to/utilization of resources.

One potential means by which states can meet the right to food is through food aid programmes. From a theoretical perspective, the effect of in-kind food aid is ambiguous. It is plausible that subsidies for staples such as rice could improve nutrition outcomes by increasing caloric intake and/or by freeing scarce household resources to spend on more diverse, nutrient-dense foods, e.g. vegetables, legumes. Some evidence shows a strong association between expanding food subsidy programmes, improved living conditions, and lower health inequalities (Drèze and Sen, 1991; Wilkinson and Marmot, 2003). If the amount of in-kind food aid is inframarginal, i.e. does not exceed the amount a household would

normally consume, the food aid should have the same effect as a cash transfer (Krishnamurthy *et al.*, 2017).

On the other hand, food subsidies are often criticized for not reflecting the complex real-life experiences and perceptions of the food-insecure people they intend to serve (Pottier, 1999). Nutrition-related policies often rely on people to access health knowledge and make healthy dietary choices on an individual level (Wilson, 1989). Wilson contends that this compounds socioeconomic inequalities in nutrition, invoking Sen's (2001) capability approach to argue that structural factors severely impair freedom to function in the context of diet and nutrition. Indeed, several studies (R. T. Jensen and Miller, 2008a; Pottier, 1999) demonstrate food consumption is far more complex than a simple economic transaction, occasionally defying basic economic principles. Evidence from China suggests where households receive subsidies for staple food items, they make substitutions that do not improve the nutritional content of diets, and may spend more on non-food items (R. Jensen and Miller, 2011). Using subsidies to make certain commodities more accessible might incentivize eligible households to consume more of these commodities.

Public Distribution System (PDS)

The PDS is India's main governmental food and nutrition security (FNS) programme to combat malnutrition. It provides subsidised staple foods--primarily rice, sugar, wheat, and cooking oil (Government of India, 2005). Eligibility varies between states, but in general is means-tested based on income and household assets, with more provisions—larger quantity and highly subsidised price—for Below Poverty Line households (Central Vigilance Committee, 2009). In 2010, about half of rural and two-fifths of urban households in the lowest wealth tertile accessed rice through the PDS (authors' calculations, Consumer Expenditure Survey National Sample Survey Organization, 2010). In the state where our

study focuses (Andhra Pradeshⁱⁱ, hereafter AP), the PDS functions well: Up to 100% of households accessing the PDS indeed receive the full food quantity they are entitled to with very low variation. However, the programme has also been criticized for alleged corruption (Jha *et al.*, 2013; NDTV, 2010; Pandey, 2011; Pillay and Kumar, 2019). The PDS provides rice, sugar, wheat flour, and red gram (dahl/pulses), but by quantity, rice and sugar are by far the most common provisions in AP.

Compared to other cereals, rice has a very low content of iron, protein and fibre (WHO, 2014). Much of rice's nutritional value is lost during processing and preparation. Some studies of rice and wheat consumption find adverse associations with nutritional outcomes (Gangopadhyay *et al.*, 2013; R. Jensen and Miller, 2011; Tarozzi, 2005), while others find no such link (Ecker and Qaim, 2011; Kochar, 2005). Recent studies underline that the consumption of highly polished white rice significantly increases blood glucose levels compared to the consumption of brown rice (Mohan *et al.*, 2014; Shobana *et al.*, 2012). WHO's recent guidelines recommend reducing the sugar intake to <5% of the total energy intake per day, i.e. 25g for an average adult (World Health Organization, 2015). This corresponds to growing evidence and a broad recognition that sugar has strong, negative impacts on health (Basu *et al.*, 2013; Lustig *et al.*, 2012; Taubes, 2017; World Health Organization, 2015). Sugar consumption is associated with overweight, diabetes, and cardiovascular diseases (Johnson *et al.*, 2007; Malik *et al.*, 2006). Increased consumption of rice and sugar would be unlikely to improve nutrition outcomes and could even worsen some outcomes.

Evidence on whether food subsidies through the PDS improve dietary intake and reduce nutritional risks is mixed, tends to be cross-sectional, and is limited to certain food items. Several studies found a link between accessing PDS subsidies and improved dietary diversity and caloric intake (Chakrabarti *et al.*, 2018; Kaul, 2014; Kishore and Chakrabarti,

2015; Rahman, 2016), though sometimes operating through consumption of items not directly provided by the PDS (Kaul, 2014). Others found an increase in the consumption of the subsidized staple food at the expense of more nutrient-dense non-staple foods (Desai and Vanneman, 2015; Kaushal and Muchomba, 2015; Khera, 2011; Shankar Shaw and Telidevara, 2014). For instance, families receiving rice through the PDS may not increase expenditure on cereals, but instead spend saved money on pulses, oil, vegetables, and sugar (Kishore and Chakrabarti, 2015). Kaushal and Muchomba (2015) found that price reductions arising from rice (and wheat) subsidies are associated not with increased caloric and protein intake, but with increased consumption of rice and sugar. Desai and Vanneman (2015) also found that PDS users consume more cereals, and further showed spending on other items such as fruit and milk is reduced in favour of items that can be purchased cheaply through the PDS.

Work in China and India has also found a link between food prices and nutrition outcomes (Chakrabarti *et al.*, 2018; R. T. Jensen and Miller, 2008b). This work, however, lacks a specific focus on nutritionally vulnerable groups whom the PDS aims to support, particularly young children. While longitudinal work on food prices and child nutrition is limited, some recent work has shown that an increase in food prices during the Global Recession was associated with an increase in wasting in India (Vellakkal *et al.*, 2015).

Food aid has the potential to reduce hunger and malnutrition, mitigating the effects of poverty and economic shocks (e.g. rising prices) by providing for dietary needs and/or freeing up monetary resources. However, the effectiveness of food aid may depend on the nutritional quality of the items on offer. We hypothesize that PDS subsidies increase rice and sugar consumption, crowding out nutritionally rich food sources and thereby failing to reduce the risk of stunting.

The remainder of the paper will (1) provide an overview of the methods used to test this hypothesis, including a description of the data and statistical modelling techniques; (2) present the result of the analysis and robustness checks; and (3) discuss the results in light of existing literature, strengths and limitations of the study and the implications of the findings for social policy.

Methods

Data

Data on children's nutrition came from the longitudinal Young Lives (YL) Survey, conducted in APⁱⁱⁱ. These secondary data are anonymized, and publicly available with user registration (Oxford Department of International Development, n.d.); no ethics approval was required for analysis. The survey is described elsewhere (Galab *et al.*, 2003). Briefly, it tracks two cohorts of children from infancy through childhood and adolescence. The cohorts were aged 6-12 months (n=2,011) and 8 years (n=1,008) at recruitment in 2002. Five waves of data have been collected. We used data for waves 2 (2006) and 3 (2009) since food consumption data were not collected for the younger cohort due to their age in the first wave, and subsequent waves are not matchable to our second data source (below). Mothers or primary caregivers reported for young children and the household. In 2009, the older cohort self-reported food consumption in the last 24 hours. Overall attrition was low--4.0% and 3.2% respectively for the young and old cohort between 2002-2009 (Barnett *et al.*, 2013).

Measures

Access to the PDS was measured based on primary caregivers' responses to the question, "If you are accessing PDS, which of the following items are you receiving" (Young Lives Study, 2006). Respondents answered yes/no for whether their household received each of the following from the PDS: rice, dahl^{iv}, sugar, kerosene, and others. We created a

dichotomous indicator for each food item (1=accessed item). We measured household wealth as a categorical measure in tertiles based on a composite index of housing quality, consumer durables, and housing services. Although the PDS is a means-tested program, not all poor households access the PDS, and many wealthier households still receive subsidized food (Jha *et al.*, 2013; Khera, 2011); PDS receipt is therefore not a proxy for poverty, nor for food insecurity. We therefore compare households which did and did not access the PDS in **Table 1** to identify whether/how these households differ on key indicators.

Food consumption was based on mothers' reports on household expenditures in Indian rupees during the last two weeks (15 days in wave 3) for 20 food items. Taken together with price data from local market hubs for AP from NSSO's Consumer Expenditure Surveys in the associated years, we calculated consumption quantity. NSSO data are available for purchase from the Indian Ministry of Statistics and Programme Implementation (National Sample Survey Organization, 2014). Following Vellakkal *et al.* (2015), we calculated food consumption in kcal for nine different food groups (rice, sugar, pulses, meat, fish, milk, eggs, fruit and vegetables), with household weights applied for PDS access, wealth tertile, and child's age (see Web Appendix). Caloric intake by food group was then used to calculate for each child: (1) total daily calorie intake as sum of calorie intake from food items from all nine food groups; (2) share of total food energy from sugar (kcal from sugar/total kcal); and (3) share of total food energy from rice (kcal from rice/total kcal).

Notably, NSSO CES data collection is slightly mismatched to the YL data. While the YL data were collected in 2006 and 2009, the NSSO CES were collected in 2005 and 2010. However, it is reasonable to assume that price variations between 2005-2006 (and 2009-2010) were uniform across villages within districts. In other words, although the absolute amount of rice, sugar, and calorie consumption might be under or overestimated, the differences between households remain constant. Concerns regarding the mismatch of data

sets used in this paper therefore do not impose serious concerns for the analyses. However, measurement error introduced by our data limitations would make it more difficult to detect a significant association between the PDS and signs of malnutrition, resulting in a conservative bias.

Our dietary diversity score is based on a 24h recall of the child's consumption across seven food groups (grains, roots, tubers; legumes, nuts; dairy; flesh foods; eggs; vitamin-A-rich fruits and vegetables; other fruits and vegetables). According to WHO, a minimum dietary diversity requirement is met if the child consumed food items from at least four different food groups in the 24 hours prior to the interview (World Health Organization, UNICEF, 2010). Following standard methods, stunting was based on two standard deviations below the mean internationally standardized height-for-age score (HAZ). Children with an age-standardized BMI two standard deviations below the mean were coded as having low BMI. Observations with missing values in at least one of the relevant variables were excluded listwise from the analysis (n= 631), leaving a final analytical sample of 5,279 observations.

Statistical Modelling

We used two-stage linear probability models to test sequentially the associations between access to subsidized food and food consumption and, subsequently, the association between this subsidised food consumption and nutritional outcomes, as follows:

$$\text{Equation 1. } \text{Rice consumption}_i = b_0 + \beta_1 * \text{PDS}_i + \beta_2 * \text{wealth}_i + \beta_3 * (\text{PDS}_i * \text{wealth}_i) + \beta_4 * \text{Sociodemographic}_i + \beta_5 * \text{Household Total}_i + \beta_6 * \text{Period and Cohort Effect}_i + \epsilon_i$$

$$\text{Equation 2. } \text{Undernutrition}_i = b_0 + \beta_1 * \text{Rice consumption}_i^* + \beta_2 * \text{wealth}_i + \beta_3 * (\text{PDS}_i * \text{wealth}_i) + \beta_4 * \text{Sociodemographic}_i + \beta_5 * \text{Household Total}_i + \beta_6 * \text{Period and Cohort Effect}_i + \epsilon_i$$

Here, i is indicator for the index child. PDS is the dichotomous indicator of access. Wealth is our control for household wealth. Sociodemographic captures individual level controls, which include a dichotomous measure of whether the primary caregiver had any formal education, number of siblings, ratio of dependent children under the age of 16 to the total household size, child's daily caloric intake over averaged over 15 days, child's age in months, and a dichotomous indicator of whether the child was female. Household includes the total logged household food expenditure for bought food items, the share of bought food items among all food expenditure, and the share of food expenditure among the total household expenditure for food and non-food items, as well as whether the household is part of a rural community. Since the sample followed two cohorts over time, we also controlled for period and cohort, and an interaction between access to the PDS and wave 3. Our choice of two-stage linear probability models captures the indirect association between PDS access and undernutrition, operating through children's food item consumption. All analyses were conducted using Stata 12.1. For a full description of variable calculations, see the Web Appendix.

Results

The pooled analytic sample comprises 5,879 observations from 2,944 children, with 66.3% of the sample (n=1,950) drawn from the young cohort and 33.7% (n=994) from the old cohort. The sample is fairly evenly split by gender (48% female). Children's ages range between 55-191 months (4-15 years) pooled across waves. On average, children have 1.73

siblings. Over half (54.4%) of primary caregivers have no formal education, and around three quarters (74.4%) of the sample live in rural areas. Approximately 87% of households accessed at least one item through the PDS, with 86.1% accessing rice and 71.4% accessing sugar. In general, rice consumption is very high, equivalent to 55% to 65% of total caloric intake. Around 34% of children are stunted, and 26% have low BMI.

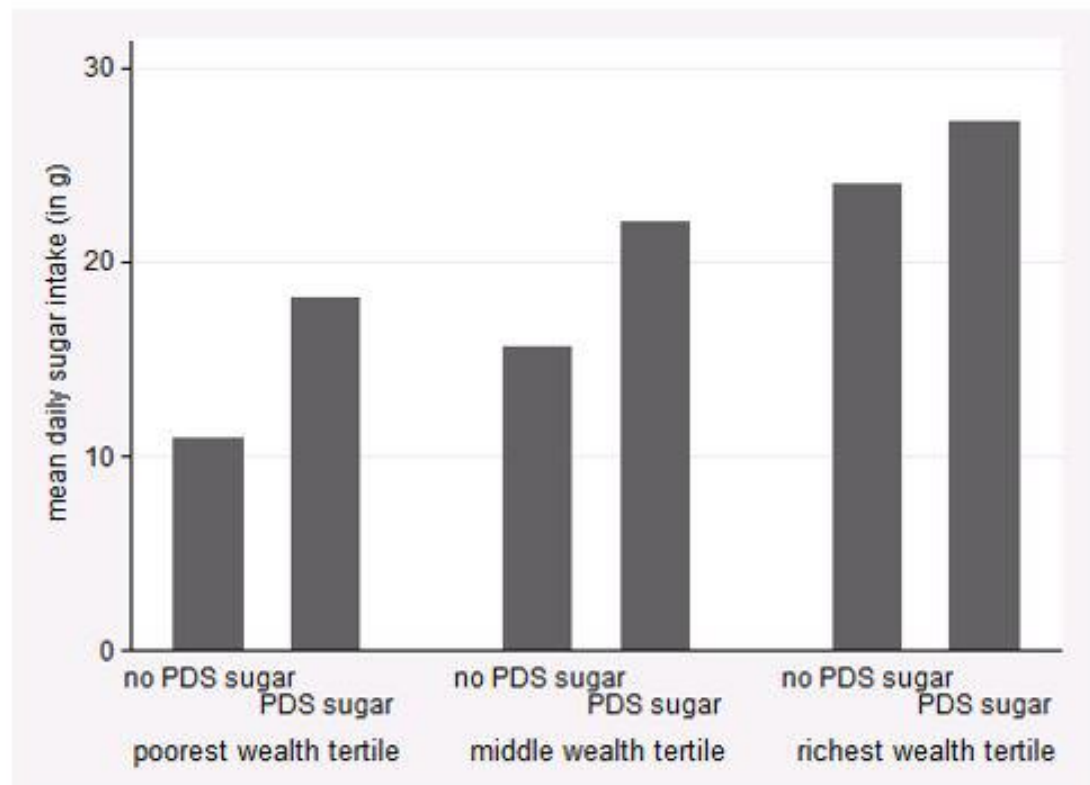
Comparing sociodemographics split by PDS access (**Table 1**), nearly all (98.8%) households that accessed at least one item through the PDS received rice, and most (81.9%) received sugar. Dietary diversity among this group was somewhat lower than for children in non-PDS households (45.0% vs. 52.1% respectively). Although the PDS is means-tested, nearly one-fifth (19.4%) of households in the poorest wealth tertile did not access any items through the PDS, while more than one-quarter (27.6%) of those in the wealthiest tertile did so. Caloric intake differed by PDS receipt, with non-PDS households consuming an average of 3,420 calories daily, compared to 2,680 in PDS households. PDS households also tended to spend somewhat less on food, but this comprised a higher share of the total household expenditure. A higher proportion of caregivers in PDS vs. non-PDS households had no formal education (57.9% vs 31.4% respectively), and PDS households were more likely to be located in rural areas (78.0%) compared to non-PDS households (50.0%). Household composition and children's age and sex were not markedly different between PDS and non-PDS households.

PDS Access to Sugar and Consumption

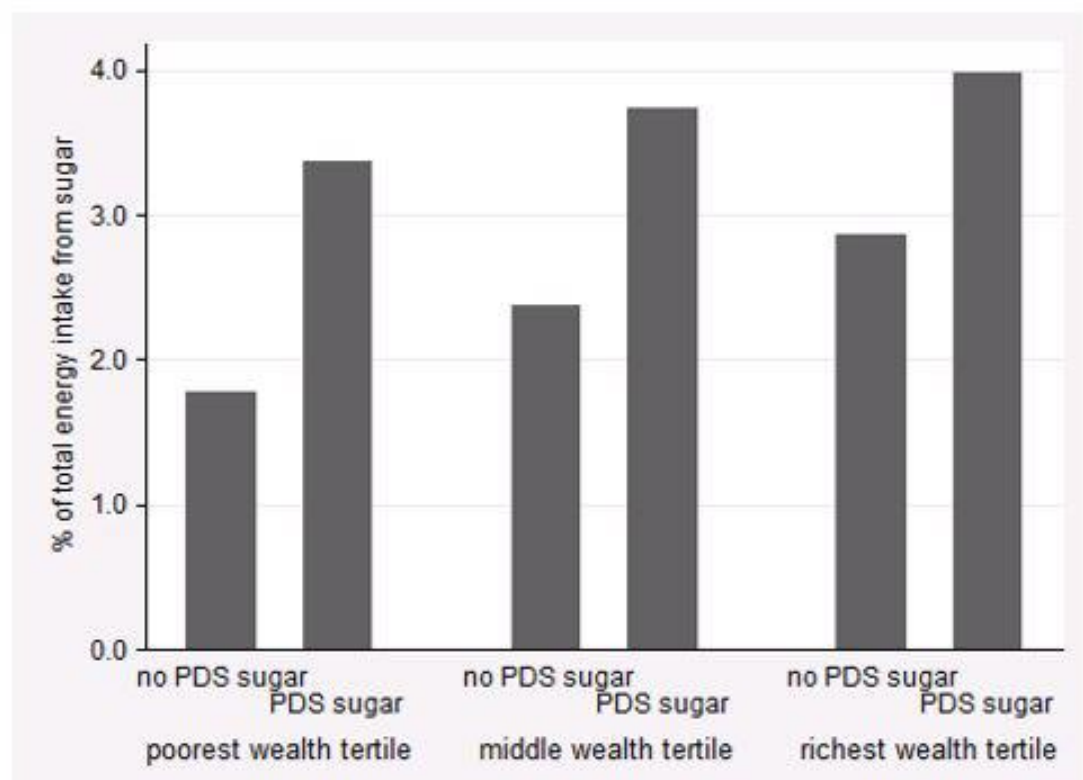
Figure 1 shows the mean quantity of daily sugar consumption in grams (a) and the dietary proportion of energy intake from sugar (b) by household wealth and access to sugar through the PDS. Children living in wealthier households tend to consume greater quantities of sugar, both in relative terms, as seen by the increase in mean consumption across wealth

tertiles, and absolute terms (left), as seen by the increase by wealth tertile in the proportion of energy intake comprised by sugar (right). PDS access also corresponds to greater sugar consumption across wealth tertiles. As shown in Figure 1b, children in households with access to subsidized sugar through the PDS consume between 3 and 7g (or 1.4 to 1.9 times) more sugar than children without access to the PDS with similar household wealth.

a. Mean Daily Intake (g)



b. Proportion of Overall Diet (%)

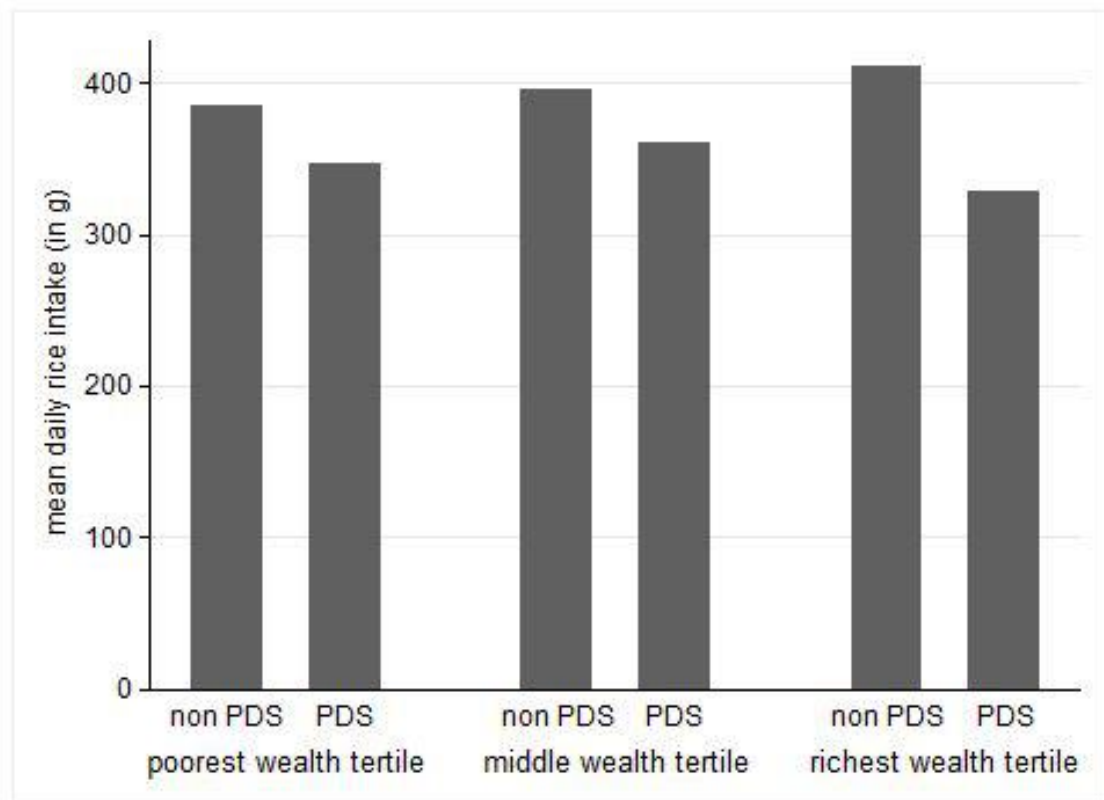
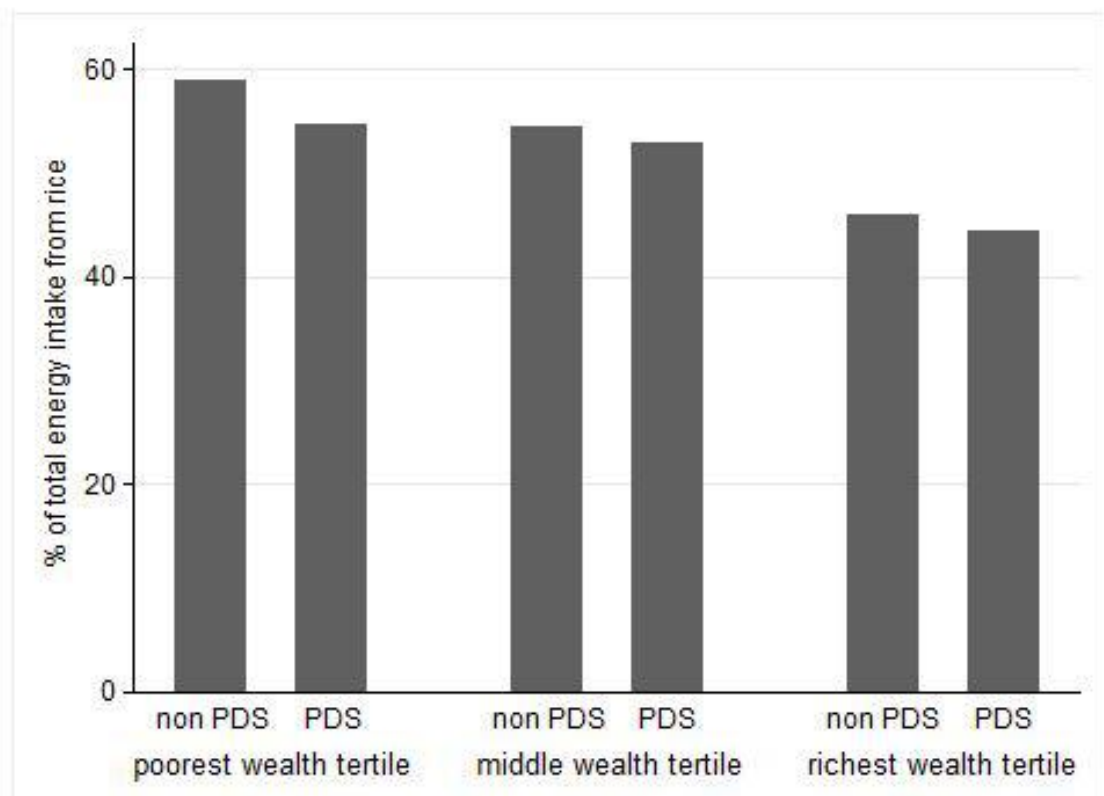


Model 1 in **Table 2** provides the results of the first-stage linear probability models assessing the association of PDS sugar access with sugar consumption. Access to subsidized sugar is associated with 7.05g higher sugar consumption per day ($b = 7.05$; $p < 0.001$).

Notwithstanding this association, children in the poorest wealth tertile consume 5.00 fewer grams ($p < 0.001$) and those in the middle wealth tertile consume 2.94 fewer grams ($p < 0.001$) of sugar compared to children in the wealthiest households. Introducing an interaction term (Model 1, **Table 3**), we do not observe a significant interaction effect between household wealth and access to PDS sugar on sugar consumption.

PDS Access to Rice and Consumption

Figure 2 shows the mean quantity of daily rice consumption (left) and the dietary proportion of rice (right) by household wealth and access to rice through the PDS. Although children in households with access to PDS rice consume less rice in absolute terms, their share of rice in the total caloric intake is similar to that of those children without PDS rice access.

a. Mean Daily Intake (g)**b. Proportion of Overall Diet (%)**

Model 1 in **Table 4** provides the results of the first-stage linear probability models of PDS rice access and rice consumption. Children with access to rice through the PDS consume on average 30g ($b=0.03$; $p<0.001$) more rice daily. Compared to children in wealthier households, children in the middle-wealth and low-wealth tertiles consume 40g and 30g more rice daily ($b=0.04$; $p<0.001$ and $b=0.03$; $p < 0.001$) respectively. However, the association between access to rice through the PDS and rice consumption varies by wealth. When we introduce an interaction term (Model 1 in **Table 5**), access to PDS rice adds an additional 50g of rice to the daily intake of children in wealthiest households, while it only adds 30g and 20g of rice respectively to the diets of children in middle and low-wealth tertiles. In short, access to PDS rice is associated with an increased consumption of rice, especially among children from wealthier households, who consume less rice overall than poorer households.

PDS-access, stunted growth, and BMI

By combining estimates from our first-stage models of the association of PDS access with food consumption with the second-stage models of the association of food consumption with nutrition outcomes, we quantified the potential reduction in nutritional risks linked to the PDS. Turning first to sugar, Models 2.1-2.5 in Table 2 show the results of the second-stage models. A 1 gram increase in sugar consumption is associated with a marginally significant increase in the likelihood of receiving an adequately diverse diet by 1% ($b=0.01$; $p<0.05$), but there is no association between sugar consumption and stunting, HAZ, nor BMI. Multiplying the coefficient for access to PDS sugar on consumption in the first-stage by the coefficient for sugar consumption in the second-stage, children with access to PDS sugar have a 0.1% (95% CI:-0.00; 0.14) higher chance of receiving an adequately diversified diet compared to those with no PDS access to rice. We did not find a significant interaction between wealth and access to PDS sugar in the first-stage, and so observe no considerable change in the coefficients with the inclusion of the interaction (Table 3, Models 2.1-2.5).

Turning next to rice, the second-stage models (excluding the first-stage wealth interaction) are provided in Models 2.1-2.5 of Table 4. Each 1kg increase in rice consumption is associated with a lower HAZ ($b=-7.44$; $p< 0.001$) and increased probability of stunting ($b=1.42$; $p< 0.05$), but not with the likelihood of receiving an adequately diversified diet nor BMI.

Combining the first-stage effect of access to PDS rice on consumption with the second-stage coefficient for rice consumption, access to PDS rice is associated with a lower HAZ by -0.22 (95% CI:0.13; 0.33) and an increased risk of being stunted by 4% (95% CI:0.02; 0.07). We observed a significant interaction between wealth and PDS rice in the first-stage model, suggesting that the association between access to PDS rice and consumption varies by wealth (Models 2.1-2.5 in Table 5). PDS rice is associated with a lower HAZ by -0.41 (95% CI:0.27; 0.55) and -0.17 (95% CI:0.07; 0.26) and an increased risk of stunting by 10% (95% CI:0.06; 0.14) and 4% (95% CI:0.02; 0.06) respectively for children in high and middle-wealth households. For children in the poorest households, access to PDS rice is associated with a -0.25 (95% CI:0.14; 0.35) decrease in HAZ and an elevated risk of stunting by 6% (95% CI:0.03; 0.09). Access to rice through the PDS appears to be negatively associated with children's long-term growth trajectory, especially for children in wealthier households. Wealth appears to act on nutrition outcomes through the level of rice consumption.

Robustness Checks

We performed several tests of our model's specification. First, we ran a Propensity Score Matching Model (PSMM)^v, allowing us to estimate the effect of receipt of PDS-subsidized rice and sugar as a treatment effect. However, since access to the PDS is very high, especially among poorer households, this did not yield reliable results. Analyses were only possible

when the sample was split by wealth tertiles. Nevertheless, the split sample yielded very similar results as the models described above, particularly in reference to the association between PDS access, wealth, and nutrition. Access to subsidized sugar is associated with a non-significant increase in the likelihood to receive an adequately diverse diet by 4% across all wealth tertiles, but is not associated with negative nutrition outcomes. Furthermore, while access to subsidized rice yields better nutrition outcomes for children in the lowest wealth tertile, for the middle and wealthiest tertile it is associated with lower HAZ (TE=-0.23; SE=0.14 and TE=-0.38; SE=0.14 respectively) and a higher risk of stunting (TE=0.09; SE=0.06 and TE=0.11; SE=0.05 respectively).

Second, considering that dietary guidelines normally include recommendations regarding the share of caloric intake from given foods (U.S. Department of Agriculture and U.S. Department of Health and Human Services, 2010), we replicated our models using share of food energy from sugar and rice instead of the absolute sugar/rice consumption. Access to PDS sugar and rice is associated with an increase in the share of sugar/rice in the total caloric intake by 1.04 and 3.39 percent points respectively. For easier interpretation of the estimates, the models using the absolute consumption was chosen.

Third, we disaggregated the models by child sex. Consistent with evidence of son-preference (Aurino, 2017; Pal, 1999; Sen and Sengupta, 1983), we found that boys received greater rice and sugar quantities in association with PDS access. This contrasts, however, with evidence that finds son preference in breastfeeding (Fledderjohann *et al.*, 2014; Jayachandran and Kuziemko, 2011), but not in other food items (Fledderjohann *et al.*, 2014; Griffiths *et al.*, 2002; Maitra *et al.*, 2006). However, much of the literature that finds no gender difference in food distribution focuses on *which* food items girls and boys consume rather than *how much*. Here, in examining quantities of food consumed, we show that, through the PDS, consumption and nutrition outcomes are slightly stronger for boys than for

girls in all models, but estimates do not differ substantially in their direction. Girls may be disadvantaged not in the content but in the quantity of food they receive, and that this may be compounded by limits on household food resources.

Fourth, some evidence suggests that factors associated with undernutrition differ in rural and urban communities (Fotso, 2007; Smith *et al.*, 2005). All analyses were run separately for households in urban and in rural communities. Associations for access to rice through the PDS and nutrition outcomes are slightly stronger in urban areas, but estimates do not differ substantially in their direction from those reported above. However, the association between access to sugar through the PDS and nutrition outcomes is much stronger in urban areas compared to rural areas.

Fifth, approximately 20% of all households reported consumption of at least one food item 2 SD above the respective mean. Considering each person has multiple measures, this observation is not surprising. Because over-reporting is not strictly random, single and multiple imputation would impose serious threats to introduce bias (Rubin, 2004). However, we ran all analyses with outliers excluded, and compared the results. Though the analyses which exclude outliers produce smaller standard errors, the estimates do not differ substantially.

Finally, to account for the possibility that eating patterns and household context vary systematically between the younger and older cohorts, we disaggregated the results by cohort. There was some minor variation in results, but they remained substantively unchanged. Results for these models are presented in the Web Appendix, with the full set of coefficients for all covariates presented.

Discussion

In this paper, we show that (1) accessing subsidized rice and sugar through the PDS is associated with an increase in both absolute and relative intake of rice and sugar, (2) access to subsidized sugar is associated with a very slight greater likelihood of an adequately diverse diet, and (3) additional proportions of rice did not reduce the risk of adverse long-term growth trajectories of children aged to 5 to 16. We also found evidence that the benefits from programmatic improvements to the PDS may be stratified by household wealth. Compared to poorer households, in wealthier households access to subsidized rice is related to greater additional rice consumption. The results of this study provide further evidence that, in their current form, India's food subsidies may not yield nutritional benefits (R. Jensen and Miller, 2011; Kochar, 2005; Tarozzi, 2005) and may incentivise consumption of nutritionally inferior food items (Ecker and Qaim, 2011; Gangopadhyay *et al.*, 2013), especially in wealthier households.

Our study constitutes an important contribution to the evidence on food subsidy schemes and nutrition outcomes in several ways. First, it outlines a mechanism for how three important elements of household and child well-being might be associated: access to food, dietary intake, and nutritional risks. Second, the study uses high quality longitudinal data to track changes in children over time, thus contributing to emerging scientific evidence regarding factors associated with recovering from stunting (Crookston *et al.*, 2010; Himaz, 2009). Third, it provides much-needed empirical evidence on the association between accessing a key governmental program (the PDS) for targeting food security and child nutrition. In extant literature, the complexity of the challenges of ensuring adequate nutrition has been recognized. However, our results provide some evidence that current policies may not fully take this complexity into account.

Two related factors may drive the association between PDS sugar consumption and dietary diversity we observed. First, sugar consumption may serve as a proxy for dietary

diversity—sugar is not nutritionally necessary, representing a frivolous addition to the diet. While food-insecure households may not prioritize sugar consumption, those with greater FNS and a more diverse basket of foods available may also consume sugar as a luxury once basic needs are met. Second, given its association with meal frequency, sugar consumption may reflect snacking on sugary treats among children in households with adequate FNS to support snacking.

Strengths and Limitations

One strength of our paper is that it offers robust evidence from a unique combination of data sources, building on this mixed literature by linking the oft-used NSSO data with rich longitudinal data to examine the associations between subsidy receipt, quantities of specific foods consumed, and nutritional outcomes. We look specifically at outcomes for children during a global economic recession—a period characterized by rising food prices and worsening outcomes for children (Christian, 2010; Fledderjohann *et al.*, 2016; Vellakkal *et al.*, 2015), during which PDS subsidies may have been a particularly important source of resilience for households. We carefully identified potential confounding factors and conducted a number of robustness checks, including using propensity score matching to account for observed confounders.

Nonetheless, our study has several limitations. First, it focuses on one state in Southern India, and cannot be generalized to the whole of India. Dietary content, nutritional challenges, and the efficiency and content of the PDS vary substantially from state to state (Chakrabarti *et al.*, 2018; Jha *et al.*, 2013; Krishnamurthy *et al.*, 2017), and AP is one of five states to have implemented a unique ‘new-style’ PDS provision that includes extremely low rice prices and near-universal coverage (Drèze and Sen, 2013; Kishore and Chakrabarti, 2015). This statewise variation may to some extent help to explain why our findings differ

from some previous evidence that has found no effects or positive effects of the PDS on nutritional outcomes.

Second, the PDS provides subsidised food to households over a sustained period of time, and not as part of an emergency plan to address short-term fluctuations in the availability of nutrients. Thus, we decided to focus on long-term nutritional outcomes (HAZ, stunting) in this study rather than short-term nutritional benefits (wasting). Children may benefit in the short run from access to subsidized food through the PDS, while such subsidies are detrimental if sustained over time. In a similar vein, given the sampling frame of the YL data, a test for the association of access to subsidized sugar with overnutrition and long-term health consequences of sugar consumption, such as cardiovascular diseases and diabetes, could not be explored in this study. Finally, we were not able to consider the consumption patterns of PDS pulses and the possible associations with child malnutrition. This is because pulses were not included in the PDS rations in AP during the time period examined here. It is possible that the availability of subsidized pulses would have a positive association with children's nutritional outcomes.

Conclusions

Considering the large costs associated with the PDS and its contribution to government budget deficit (Sharma, 2012), our findings highlights the need to carefully monitor the impact of the scheme on children's dietary diversity and nutritional outcomes. This does not suggest the need for a drastic overhaul of the PDS is needed *per se*. However, there is a need to further understand how access to different entitlement packages through the PDS might impact on the items and quantities of food consumed, and on the nutritional sequelae of dietary choices.

This study provides some initial evidence that several adjustments to the PDS may improve its performance. First, better targeting of the rice subsidy to those households with deficits in daily energy requirements could potentially improve gains. As we found no evidence of improvements in child HAZ, sugar could potentially be dropped from the PDS. Second, alternative incentive structures to consume an adequate, well-composed diet could be put into place. These might include social and behaviour change campaigns addressing the importance of an adequate nutrient intake and a balanced diet. However, such campaigns will be ineffective without structural support to empower families to make dietary changes (Wilson, 1989). Third, nutrient intake could be improved without changing existing consumption patterns through fortification of the food items provided as part of the PDS and the incorporation of more nutritious food items in the entitlement package.

ⁱ Limited or inconsistent access to adequate safe and nutritious food to meet dietary needs.

ⁱⁱ Andhra Pradesh was bifurcated in 2014. Here “Andhra Pradesh” refers to the original territory of Andhra Pradesh and Telengana.

ⁱⁱⁱ One of India’s larger states (75 million people), diets of AP traditionally rely heavily on rice, making PDS subsidies particularly relevant (Khera, 2011b). In AP, 69.4% of rural and 53.1% of urban households accessed rice through the PDS in 2005, with these figures rising to 90.9% for rural and 87.9% for urban households in 2010 according to data from the National Sample Survey Office (NSSO) Consumer Expenditure Reports (National Sample Survey Organization, 2010, 2005).

^{iv} Dahl was not included in the PDS rations until around the time of the final round of YL data we examine here; as a result of this being a brand new provision, only about 2% of the entire sample accessed PDS dahl rations, which prevented us from modelling PDS dahl consumption here.

^v We used Nearest Neighbor and Kernel matching methods in these calculations. Results from the Nearest Neighbor matching estimations are reported. The PSMM models control for the same potential observable selection bias as the IV models, which are total carbohydrates consumption, household expenditure, household and child characteristics, as well as cohort and wave.

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Table 1. Descriptive statistics for PDS households, non-PDS households, and all households, young and old cohort, Young Lives Waves 2-3, 5,879 observations

	Total			PDS			non PDS		
	mean	sd	n	mean	sd	n	mean	sd	n
access to rice through PDS	86.1%	0.35	5844	98.8%	0.11	5093	0.0%	0	751
access to sugar through PDS	71.4%	0.45	5843	81.9%	0.39	5092	0.0%	0	751
minimum dietary diversity	46.0%	0.50	5880	45.0%	0.50	5093	52.1%	0.50	787
richest wealth tertile	32.9%	0.47	5879	28.3%	0.45	5092	63.3%	0.48	787
middle wealth tertile	33.6%	0.47	5879	36.1%	0.48	5092	17.3%	0.38	787
poorest wealth tertile	33.5%	0.47	5879	35.6%	0.48	5092	19.4%	0.40	787
access to rice through PDS (richest wealth tertile)	24.0%	0.43	5843	27.6%	0.45	5092	0.0%	0.00	751
access to rice through PDS (middle wealth tertile)	31.2%	0.46	5843	35.8%	0.48	5092	0.0%	0.00	751
access to rice through PDS (poorest wealth tertile)	30.8%	0.46	5843	35.4%	0.48	5092	0.0%	0.00	751
total daily energy intake (in 1,000 kcal)	2.77	1.47	5467	2.68	1.44	4804	3.42	1.51	663
household food expenditure									
% of food item purchased	86.7%	17.40	5788	85.9%	17.45	5043	91.9%	16.08	745
food expenditure (ln)	6.79	0.58	5789	6.76	0.57	5044	7.02	0.60	745
% of food expenditure in total household expenditure	52.7%	0.15	5692	53.4%	0.15	4962	48.0%	0.15	730
household characteristics									

primary caregiver with no education	54.4%	0.50	5874	57.9%	0.49	5087	31.4%	0.46	787
household living in rural area	74.4%	0.44	5851	78.0%	0.41	5093	50.0%	0.50	758
household composition									
number of siblings	1.73	1.08	5878	1.76	1.09	5091	1.54	0.98	787
ration of children/ household size	45.0%	0.13	5837	45.1%	0.13	5076	44.5%	0.13	761
child characteristics									
sex (1=female)	48.2%	0.50	5880	48.2%	0.50	5093	48.4%	0.50	787
age (in months)	108.48	42.70	5849	109.30	42.64	5092	102.97	42.69	757

Table 2. Linear probability of malnutrition, sugar consumption, and access to sugar through the PDS, young and old cohort, Young Lives Waves 2-3, 5,279 observations

	FIRST-STAGE		SECOND-STAGE			
	Model 1	Model 2.1	Model 2.2	Model 2.3	Model 2.4	Model 2.5
	Sugar (in g) /day \pm SE	Min dietary div \pm SE	HAZ \pm SE	Stunted \pm SE	BMI-for-age z-score \pm SE	Low BMI \pm SE
Access to sugar through PDS	7.05*** \pm 0.50					
Sugar consumption in g/day		0.01* \pm 0.00	0.00 \pm 0.01	-0.00 \pm 0.00	0.00 \pm 0.01	-0.00 \pm 0.00
Richest wealth tertile (ref)						
Poorest wealth tertile	-5.00*** \pm 0.76	-0.08** \pm 0.03	-0.22*** \pm 0.06	0.07** \pm 0.02	-0.02 \pm 0.06	-0.02 \pm 0.02
Middle wealth tertile	-2.94*** \pm 0.76	-0.04* \pm 0.02	-0.15** \pm 0.05	0.05* \pm 0.02	-0.08 \pm 0.05	-0.00 \pm 0.02

Notes Estimates of 2nd stage of 2SLS difference model. 1st and 2nd stage models are adjusted for household food expenditure, household composition, other household characteristics, child characteristics, period effect, and duration dependency. Robust standard errors reported; * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Table 3. Linear probability of malnutrition, sugar consumption, and access to sugar through the PDS interacted with household wealth, young and old cohort, Young Lives Waves 2-3, 5,279 observations

	FIRST-STAGE		SECOND-STAGE			
	Model 1	Model 2.1	Model 2.2	Model 2.3	Model 2.4	Model 2.5
	Sugar (in g) /day \pm SE	Min dietary div \pm SE	HAZ \pm SE	Stunted \pm SE	BMI-for-age z-score \pm SE	Low BMI \pm SE
Access to sugar through PDS	6.78*** \pm 0.93					
Sugar consumption in g/day		-0.00 \pm 0.00	-0.02* \pm 0.01	0.00 \pm 0.00	-0.01 \pm 0.01	0.00 \pm 0.00
Richest wealth tertile (ref)						
Poorest wealth tertile	-5.31*** \pm 1.03	-0.17*** \pm 0.05	-0.53*** \pm 0.11	0.18*** \pm 0.05	-0.17 \pm 0.12	0.03 \pm 0.04
Middle wealth tertile	-3.18** \pm 1.06	-0.12** \pm 0.04	-0.40** \pm 0.11	0.12** \pm 0.04	-0.15 \pm 0.10	0.01 \pm 0.04
PDS sugar * richest wealth (ref)						
PDS sugar * poorest wealth	0.43 \pm 1.12					
PDS sugar * middle wealth	0.31 \pm 1.21					

Notes Estimates of 2nd stage of 2SLS difference model. 1st and 2nd stage models are adjusted for household food expenditure, household composition, other household characteristics, child characteristics, period effect, and duration dependency. Robust standard errors reported; * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Table 4. Linear probability of malnutrition, rice consumption, and access to rice through the PDS, young and old cohort, Young Lives Waves 2-3, 5,279 observations

	FIRST-STAGE		SECOND-STAGE			
	Model 1	Model 2.1	Model 2.2	Model 2.3	Model 2.4	Model 2.5
	Rice (in g) /day \pm SE	Min dietary div \pm SE	HAZ \pm SE	Stunted \pm SE	BMI-for-age z-score \pm SE	Low BMI \pm SE
Access to rice through PDS	0.03*** \pm 0.01					
Rice consumption in g/day		-0.81 \pm 0.75	-7.44*** \pm 2.05	1.42* \pm 0.71	-2.12 \pm 1.76	-0.17 \pm 0.65
Richest wealth tertile (ref)						
Poorest wealth tertile	0.04*** \pm 0.00	-0.08* \pm 0.04	0.08 \pm 0.10	0.03 \pm 0.04	0.05 \pm 0.09	-0.00 \pm 0.03
Middle wealth tertile	0.03*** \pm 0.00	-0.03 \pm 0.03	0.10 \pm 0.09	0.01 \pm 0.03	-0.01 \pm 0.08	0.01 \pm 0.03

Notes Estimates of 2nd stage of 2SLS difference model. 1st and 2nd stage models are adjusted for household food expenditure, household composition, other household characteristics, child characteristics, period effect, and duration dependency. Robust standard errors reported; * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Table 5. Linear probability models of malnutrition, rice consumption, and access to rice through the PDS interacted with household wealth, young and old cohort, Young Lives Waves 2-3, 5,279 observations

	FIRST-STAGE		SECOND-STAGE			
	Model 1	Model 2.1	Model 2.2	Model 2.3	Model 2.4	Model 2.5
	Rice (in g) /day \pm SE	Min dietary div \pm SE	HAZ \pm SE	Stunted \pm SE	BMI-for-age z-score \pm SE	Low BMI \pm SE
Access to rice through PDS	0.05*** \pm 0.01					
Rice consumption in g/day		-1.00 \pm 0.71	-8.26*** \pm 2.11	1.95** \pm 0.65	-2.71 \pm 1.77	0.47 \pm 0.59
Richest wealth tertile (ref)						
Poorest wealth tertile	0.07*** \pm 0.01	-0.04 \pm 0.05	0.02 \pm 0.14	0.07 \pm 0.05	0.09 \pm 0.13	0.03 \pm 0.05
Middle wealth tertile	0.05*** \pm 0.01	-0.07 \pm 0.05	0.12 \pm 0.14	-0.00 \pm 0.05	-0.07 \pm 0.11	0.01 \pm 0.04
PDS rice * richest wealth (ref)						
PDS rice * poorest wealth	-0.03** \pm 0.01					
PDS rice * middle wealth	-0.02 \pm 0.01					

Notes Estimates of 2nd stage of 2SLS difference model. 1st and 2nd stage models are adjusted for household food expenditure, household composition, other household characteristics, child characteristics, period effect, and duration dependency. Robust standard errors reported; * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$