

# IMPACTS OF MALNUTRITION ON LABOR PRODUCTIVITY: EMPIRICAL EVIDENCES IN RURAL BRAZIL

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## RESUMO

Neste artigo investigam-se os impactos da subnutrição sobre a produtividade do trabalho, analisando a armadilha da pobreza nutricional (APN). Verifica-se o efeito da ingestão de micronutrientes (ferro e vitaminas A, B1 e B2) e de calorias sobre as rendas dos chefes de famílias para os setores agrícola, não agrícola, conta-própria e outros empregos. Utiliza-se uma variação do método de Durbin e McFadden (1984) para correção de viés de seleção baseado em modelos *logit multinomiais*. Os dados foram provenientes das Pesquisas de Orçamento Familiar/IBGE de 2002-2003 e 2008-2009 para a área rural do Brasil. Os resultados demonstram que embora as deficiências de micronutrientes ainda persistam como problemas de saúde pública no Brasil, ocorreu uma melhora no período analisado.

**Palavras-chave:** Armadilha da pobreza nutricional, privação de calorias e micronutrientes, Modelo Logit Multinomial

**Classificação JEL:** C24, I32, J43

**Área ANPEC:** Área 13 - Economia do Trabalho

## ABSTRACT

This article studies the impacts of malnutrition on labor productivity, analyzing the Nutrition-Based Poverty Trap (NPT). We verify the effects of micronutrient and calorie intake (iron and vitamins A, B1 and B2) on the incomes of household heads for the agricultural, non-agricultural, independent and other employments sectors. We applied a variation of the Durbin and McFadden (1984) methods for the correction of the selection bias based on the *multinomial logit* data, obtained from the Family Budget Research/IBGE carried out from 2002-2003 and 2008-2009 in rural Brazil. Results suggest that although micronutrient deficiencies still persist as a public health problem in Brazil, there was an improvement during the analyzed period of time.

**Keywords:** nutrition-based poverty trap, calorie and micronutrient deprivation, multinomial logit model.

**Classification: JEL:** C24. I32. J43

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## 1 INTRODUCTION

A considerable amount of the recent literature on economic development has been concerned about wellbeing determinants included in the millennium goals. One of the key elements to comply with such goals is the reduction of malnutrition. With this perspective, the main proposal of this study is to investigate the impacts of malnutrition on labor productivity in densely populated countries, where labor demand is often lower than labor offer. As a consequence, the lack of opportunities in the labor market results in low wages. In this context, the poor are doubly affected: they don't receive any profits from assets, as they don't have them, and they also have a restricted access to working opportunities.

Micronutrients and wage categories may suggest that a policy aimed at increasing nutritional intake by the malnourished population sector may lead to a growth in salary revenues. This would demonstrate the importance of a policy to grant nutritional supplements to the deprived population. The crucial question to be answered is if an improvement in nutrient intake could have any significant effects on rural income and therefore, on the possibility to break this trap, as well as on the reduction of poverty in rural Brazil. Consequently, the main focus of the public policies should be on raising awareness on nutritional implications. This would highlight the importance of a direct nutritional supplements policy, besides the inclusion of policies to directly reduce poverty.

The effects of nutritional intake on labor productivity and on wage levels have been an important research area for health economists and nutritionists. The hypothesis of efficient wages shows that in developing countries such as Brazil, which suffer from particularly low nutritional levels, workers are physically incapable of performing hard physical work, which results in low productivity and low wages, low purchase power and consequently, low nutritional levels, completing a vicious cycle of misery. This cycle also diminishes the chances of these workers to escape the Nutrition-Based Poverty Trap. (NPT).

Among the papers that empirically test the existence of a NPT we can mention those of Strauss (1986), Thomas and Strauss (1997), Deolalik (1988), Barret (2002) and Jha, Gaiha and Sharma (2009). There are also other studies that analyze the effects of micronutrient and calorie deficiency in workers' productivity, such as Stamoulis, Pingaly and Shetty in 2004. As for the national production however, there is no economics literature on the importance of quantifying micronutrient and calorie deficiency in the nutrition-based poverty trap development and consequently on the impact of this deprivation in labor productivity. With this in mind, this article aims mainly at analyzing the poverty trap with regards to nutrition, verifying the effect of micronutrients intake (iron and vitamins A, B1 and B2) and calories on the income of family heads. Seeking to comply with these goals, we apply a variation of the Durbin –Mcfadden method (1984) to correct the selection bias based on *multinomial logit* models, in agreement with Bourguignon, Fournier and Gurgand (2004). The main goal is to foresee the probabilities of an individual to participate in the labor market and use them as income determinants to verify the existence of the nutrition-based poverty trap (NPT). The database is created based on the Family Budget Research (FBD) 2002-2003 and 2008-2009 for rural Brazil.

The rest of this paper is organized in seven sections. Sections 2 and 3 review specialized literature on nutrition deprivation and on the nutrition-based poverty trap. The fourth section introduces a methodology that corrects the selection bias problem based on multinomial logit models. The fifth section introduces the database and the econometric models to be estimated. The sixth and seventh sections analyze estimated results and draw the final conclusions.

## 2 THEORETICAL AND EMPIRICAL ASPECTS OF NUTRITIONAL DEPRIVATION AND THE NUTRITION-BASED POVERTY TRAP

The pioneering works that relate wages, nutrition and productivity at work expressed by the initial hypothesis of an efficiency wage were developed by Leibenstein (1957), Mirrlees (1975) and Stiglitz (1976) among others. They advocate that productivity has a non-linear dependency on nutrition and that an increase in worker calorie intake generates marginal productivity gains and consequently, higher wages.

The hypothesis of efficiency wage models based on nutrition according to Mirrlees (1975) is that high wages may increase worker productivity as with higher wages, they may buy more food, becoming better nourished and therefore, more productive at work.

According to Leibenstein (1957), worker productivity is determined by the salary, as it enables for the purchase of food, which supplies the energy that allows the worker to become more productive at work. With this same perspective, Stiglitz's theoretical essay (1976) describes the productivity dependence of workers on the nutritional contents of their eating habits, which means that the consumption of more nutritive foods has a positive impact on productivity and therefore, on wages. On the other hand, the study developed by Ahmed *et al* (2007) corroborated that there was a significant reduction in calorie deprivation in India from 1997 to 2003.

There is a specific international literature that empirically tests the existence of the NPT. Using data from rural families in Sierra Leone, from May 1974 to April 1975, Strauss (1986) quantified the effects of nutritional patterns measured through the caloric intake in the annual agricultural production and in the labor productivity. He found that calorie intake had significant and important effects on the agricultural production. He concluded that an adequate calorie intake exerted a positive correlation with family productivity.

In a research based on the impact of four health indicators (height, body mass index, calorie intake per capita and protein intake) developed for Brazilian workers' wages in urban areas, Thomas and Strauss (1997) using a database provided by the National Studies on Family Expenses (ENDEF) between August 1974 and August 1975, verified that these four indicators had a positive and significant effect on wages. Such fact was due to an improvement in the health and nutrition situation of the urban poor.

Contrary to this however, Deolalik (1988) applying a regression panel data of fixed effects of an adequacy of wages and rural agricultural production in Southern India from 1976 to 1978, discovered that calorie intake does not affect wages or productivity, suggesting that the human body can adapt to short-term calorie intake deficits. However, he found out that height and weight does affect wages and productivity and that such results suggest that malnutrition is an important determinant of productivity and wages.

By analyzing rural data from India from 1966 to 1969, Swamy (1997) proved that wages based on the efficiency wage modes based on nutrition are rigid, as when they decrease they also reduce the workers activity and increase the cost per labor efficiency unit. In a theoretical study, Barret (2002) discovered that micronutrient deficiency reduces physical and cognitive activity, thus affecting work productivity. Such deficiency also indirectly decreases productivity by increasing worker susceptibility to disease and infections.

Using data from the World Bank from 1994 to 1996, Horton and Ross (2003) showed that iron deficiency in ten developing countries such as Honduras, Bangladesh, Nicaragua and Bolivia among others is related to a number of functional consequences with economic implications, such as mental deterioration in children and low productivity in adult work. Likewise, Lorch (2001) proved that vitamin A deficiency (carotene) is a serious malnutrition that weakens the immunologic system and may lead to blindness.

Micronutrient deficiency may also provoke a deep impact on worker productivity and performance, as advocated by the study developed by Lukaski (2004). Specifically, a deficiency in Vitamin B may cause weakness, reduced stamina, loss of weight and body mass, whereas a deficiency in vitamin B2 may lead to alterations in the skin, the mucous membrane and the nervous

system. Vitamin A deficiency may cause loss of appetite and increased susceptibility to infections while iron deficiency is a common cause of anemia, cognitive deterioration and abnormalities in the immunologic system. Therefore, it is important to examine the effects of micronutrient and calorie deficiency in workers' productivity, in which the specialized literature has been focused on. (LAKDAWALLA, PHILIPSON and BHATTACHARYA, 2005).

In an analysis of micronutrient deficiency, Lakdawalla, Philipson, and Bhattacharya (2005) adopted data from the National Health and Nutrition Examination Survey III (NHANES) which contains demographic features, laboratorial analysis with blood samples and nutritional information collected from families from 1988 to 1994 in the USA. They estimated linear probability models and discovered that nutritional deficiencies (vitamins A and C, folic acid and anemia) vary according to food prices, as lower costs improve nutrition and obesity is the adverse effect of economic growth.

The existent gap in specialized literature on nutrition, poverty and wages is the negligence of the impact of micronutrient deprivation on labor productivity, in other words, the possibility of the existence of NPT related to micronutrient deficiency. An important contribution in this sense was made by Weinberg (2003) who adopted the two-stage least square estimation method (2SLS) and analyzed the impact of iron deficiency in labor productivity in rural India from July 1992 to June 1994. However, this author does not model the impact of micronutrient deficiency applying the nutrition-based poverty trap.

Seeking to fill that gap, Jha, Gaiha and Sharma (2009) tested the existence of the nutrition-based poverty trap (NPT) for four micronutrients and calorie intake (carotene, iron, riboflavin and thiamine) for rural India from January to June 1994 for three different wage levels (plantation, harvest and others) in male and female workers. They used the Heckman sample (1976, 1979) and verified the existence of NPT in ten cases, which proves that micronutrient deficiency has a significant impact on agricultural worker productivity, mainly on females.

In the national literature we should highlight Castro's work (1932, 1946) as one of the pioneers in the topic of hunger, poverty, malnutrition and infant mortality, as he analyzed nutrition needs based on data on the metabolism of the Brazilian population.

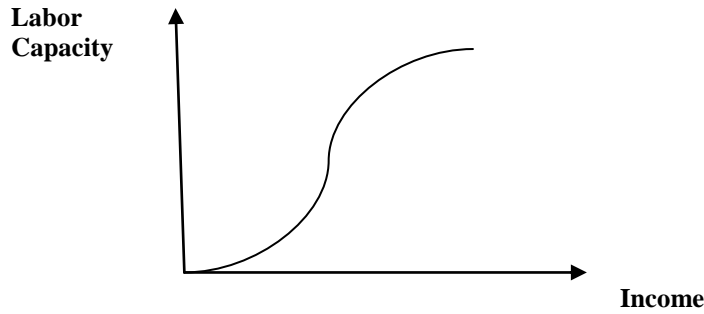
The referred author performed an economics study on nutrition patterns of the Recife working class, highlighting the living conditions of this population sector, which are narrated in his book *The Physiological Problem of Nutrition in Brazil* (1932). He concluded that most workers lived in famine and died of hunger, as the wages they were paid were insufficient to select food according to the calories they provide and the amount they needed. In his work *The Geography of Famine* (1946), the referred author introduced the problem of malnutrition and feeding deficiency by demonstrating that Brazilians suffered from nutritional deficiency (in proteins, mineral salts and vitamins) diversified in the most widespread areas of the national territory.

At a national level, there is no economics literature on the importance of quantifying the micronutrient and calorie deficiency and the progress of the nutrition-based poverty trap and consequently, the impact of such deprivation on labor productivity. This paper seeks to fill that gap.

### **3 NUTRITION-BASED POVERTY TRAP**

The capacity curve is related to the labor capacity an individual can achieve for a given task and the quantity of energy necessary to perform a certain task. The stylized version of the relation between labor capacity and nutrition, according to Jha, Gaiha and Sharma (2009) is shown in Figure 1. It is assumed that income is a synonym of nutrition in the sense that all income is converted into nutrition, which means that the money earned by the poor is entirely spent on food.

**Figure 1- Capacity Curve**



Source: Jha, Gaiha and Sharma (2009)

For much lower income levels, all the energy from food intake goes to the *resting metabolism*, which is the minimum calorie quantity that the body needs to keep working properly (breathing, body temperature, etc). According to FAO (Food and Agriculture Organization) data from 2001, the minimum amount of energy for a Brazilian “reference man” with a weight of 65 kilos would be of 1,900 kcal per person a day. During this stage, little energy is allocated to work, so the capacity curve in this area is next to zero. When the resting metabolism is filled, the additional energy is sent to fill the energy required to perform physical work. As from a certain income level, the labor capacity quickly improves due to the growth in the required energy to perform work.

When all the human body energy obtained from food intake is satisfied, the capacity to work increases at decreasing rates, due to the natural limit imposed by the human body. In other words, for very low income levels, we have the well-known decreasing scale returns factor. The non-linear graphic represented by a convex and a concave region represents the possibility of the existence of involuntary unemployment and the consequent persistence of poverty.

The labor market is a mechanism of income and opportunity generation to acquire good health and nutrition. According to Dadgupta and Ray (1986) the labor market movement can be affected by a malnutrition problem, as it affects the capacity of the human body to perform tasks that generate income. Poverty may lead to malnutrition and the latter provokes low productivity. Consequently, a large part of the population may be prisoner of a poverty trap due to the malnutrition problem.

#### **4 SELECTION BIAS CORRECTIONS BASED ON MULTINOMIAL LOGIT MODELS**

Among the different sample selection modalities, there is one that appears when the dependent variable is observed solely for a defined population subgroup such as the income variable that is only noticed in individuals with a strictly positive labor day. In the simplest cases, in which the observation of the variable of interest is determined by a binary variable, the problem of endogenous selection may be easily solved through the procedure proposed by Heckman (1979) which consists of a two-stage regression on the system:

$$y_1 = x_1\beta_1 + u_1 \quad (1a)$$

$$y_2 = 1[x_2\delta_2 + v_2 > 0] \quad (1b)$$

In which (1a) is the equation that explains the variable of interest with regards to a vector of observable behavior  $x_1$  and a disturbance  $u_1$ , called structural equation; (1b) is the equation that explains the binary variable  $y_2$  through the observable behavior vector  $x_2$  and the non-observable characteristics  $v_2$ , called selection equation;  $(x_1, x_2)$  are always observable and the variable  $y_1$  is only observed when  $y_2 = 1$ .

According to Heckman (1979), consistent estimators for  $\beta_1$  and  $\gamma_1$  may be obtained through the regression of Ordinary Least Squares (OLS) of  $y_{i1}$  on  $x_{i1}$  and  $\hat{\lambda} \equiv \lambda(x_{i2}, \hat{\delta}_2)$ , being the last one an estimator of  $\delta_2$  obtained through the previous estimation of a *probit* for (1b), in which  $\lambda(\cdot)$  is the inverse *Mills* ratio such that  $\lambda(x_2\delta_2) \equiv \frac{\phi(x_2\delta_2)}{\Phi(x_2\delta_2)}$ ,

In more complex models however, the selection takes place through a discrete choice multinomial process. According to Bourguignon, Fournier and Gurgand (2004), the configuration problem is as follows:

$$y_1 = x\beta_1 + u_1 \quad (2a)$$

$$y_j^* = z\gamma_j + \eta_j, \quad j = 1, 2, \dots, M \quad (2b)$$

Where disturbances  $u_1$  satisfy  $E(u_1/x, z) = 0$  and  $V(u_1/x, z) = \sigma^2$ ;  $j$  represents a category variable that describes the agent choice among the  $M$  alternatives based on “utilities”  $y_j^*$ ; vectors  $z$  and  $x$  contain the variables that explain alternatives and the variable of interest respectively, without loss of generality. It is assumed that the variable  $y_1$  is observed only if the category 1 is selected, which happens when  $y_1^* > \max_{j \neq 1}(y_j^*)$ . This condition equals to  $\varepsilon_1 < 0$  if we define  $\varepsilon_1 = \max_{j \neq 1}(y_j^* - y_1^*) = \max_{j \neq 1}(z\gamma_j + \eta_j - z\gamma_1 - \eta_1)$ . As demonstrated by McFadden (1973) and assuming that  $(\eta_j)$  are independent and identically distributed through the Gumbel distribution, this specification leads to the *multinomial logit* model, with the response probability  $P(\varepsilon_1 < 0/z) = \frac{\exp(z\gamma_1)}{\sum_j \exp(z\gamma_j)}$ .

Therefore, based on the above equation, consistent estimators for  $(\gamma_j)$ 's may be easily obtained through maximum likelihood. However, the problem continues to be how to estimate the vector for  $\beta_1$  parameters, considering that disturbances  $u_1$  may not be independent from all the  $(\eta_j)$ 's, in such a way that this may introduce some correlation among explanatory variables and the disturbances term in the equation of interest (2<sup>nd</sup>). Consequently, OLS estimators for  $\beta_1$  are inconsistent.

Generalizing on the Heckman process (1979), Bourguignon, Fournier and Gurgand (2004) demonstrated that the selection bias correction may be based on the  $u_1$  conditional median such that

$$E(u_1/\varepsilon_1 < 0, \Gamma) = \int \int_{-\infty}^0 \frac{u_1 f(u_1, \varepsilon_1/\Gamma)}{P(\varepsilon_1 < 0/\Gamma)} d\varepsilon_1 du_1 = \lambda(\Gamma), \text{ where, } \Gamma \equiv \{z\gamma_1, z\gamma_2, \dots, z\gamma_M\} \text{ and } f(u_1, \varepsilon_1/\Gamma)$$

is the joint conditional density of  $u_1$  and  $\varepsilon_1$ .

They also concluded that as relations among the  $M$  components of  $\Gamma$  and the corresponding  $M$  probabilities may be inverted, there is an unique  $\mu$  function that may be replaced by  $\lambda$  in such a way that  $E(u_1/\varepsilon_1 < 0, \Gamma) = \mu(P_1, \dots, P_M)$ .

Thus, consistent estimators for  $\beta_1$  may be obtained through one of the two following regressions:  $y_1 = x_1\beta_1 + \mu(P_1, \dots, P_M) + w_1$  ou  $y_1 = x_1\beta_1 + \lambda(\Gamma) + w_1$  where  $w_1$  is the independent residual of the average regression.

However, as the estimation of a large number of parameters becomes necessary when we have a vast choice of alternatives, restrictions on  $\mu(P_1, \dots, P_M)$  or likewise, on  $\lambda(\Gamma)$ , must be imposed in order to keep the problem within control and it is exactly in that respect that bias correction methods proposed in literature differ.

<sup>1</sup>  $\phi(\cdot)$  e  $\Phi(\cdot)$  are the density function and the normal standard of accumulated distribution function respectively.

In the method proposed by Durbin and Mc Fadden (1984), we accept the hypothesis of linear disturbances, expressed through the  $u_1$  average conditional to  $(\eta_j)$ 's through

$$E(u_1/\eta_1, \dots, \eta_M) = \sigma \sum_{j=1, \dots, M} r_j (\eta_j - E(\eta_j)) \text{ com } \sum_{j=1, \dots, M} r_j = 0 \quad (3)$$

This means that  $E(u_1/\eta_1 \dots \eta_M) = \sigma \sum_{j=2, \dots, M} r_j (\eta_j - \eta_1)$ . Based on this condition and on the multinomial logit model, Durbin and McFadden (1984) obtained that  $E\left(\eta_j - \eta_1 / y_1^* > \max_{s \neq 1} (y_s^*), \Gamma\right) = \frac{P_j \ln(P_j)}{1 - P_j} + \ln(P_1), \forall j > 1$ . Consequently, they proposed that the model described in (2a) and (2b) could be estimated through the OLS by the following equation:

$$y_1 = x_1 \beta_1 + \sigma \sum_{j=2, \dots, M} r_j \left( \frac{P_j \ln(P_j)}{1 - P_j} + \ln(P_1) \right) + w_1 \quad (4)$$

When analyzing such procedure, Bourguignon, Fournier and Gurgand (2004) noticed that the hypothesis (3) imposed a specific kind of linearity between entre  $u_1$  and the *Gumbel* distributions of  $(\eta_j)$ 's, thus restricting the distribution types permitted for  $u_1$ . They suggested a hypothesis variation that could turn  $u_1$  linear in a set of normal distributions, allowing  $u_1$  to be normal with:  $E(u_1/\eta_1 \dots \eta_M) = \sigma \sum_{j=1, \dots, M} r_j^* \eta_j^*$  <sup>2</sup> in which  $r_j^*$  are correlations between  $u_1$  and standardized normal variables  $\eta_j^* = J(\eta_j) = \Phi^{-1}(G(\eta_j)), j = 1 \dots M$ , <sup>3</sup>. Considering a sample selection, the authors derived

the following conditional logits:  $E\left(\eta_1^* / y_1^* > \max_{s \neq 1} (y_s^*), \Gamma\right) = m(P_1)$  and

$E\left(\eta_j^* / y_1^* > \max_{s \neq 1} (y_s^*), \Gamma\right) = m(P_j) P_j / (P_j - 1)$  where  $m(P_j) = \int J(v - \log P_j) g(v) dv, \forall j$ . With this, they concluded that after the hypothesis alteration, the regression equation (4) could be expressed as:

$$y_1 = x_1 \beta_1 + \sigma \left[ r_1^* m(P_1) + \sum_{j=2, \dots, M} r_j^* m(P_j) \frac{P_j}{(P_j - 1)} \right] + w_1 \quad (5)$$

According to equation (5), the factors or variables that correct the selection bias are defined as  $m_0 = m(P_1)$  and  $m_j = m(P_{j+1}) \frac{P_{j+1}}{(P_{j+1} - 1)}$  for  $j=1, 2, \dots, M-1$  in which  $\sigma_1^*, \sigma_2^*, \sigma_3^*, \dots, \sigma_M^*$  are the respective parameters to be estimated.

By applying Monte-Carlo experiments to compare bias correction methods performances based on multinomial *logit* models (MLM), the authors verified that most of the times the method proposed by Dubin and McFadden (1984) was preferable to both the most commonly used Lee method (1983), and to the semi-parametric alternative proposed by Dahl (2002). Experiments showed that the Durbin - McFadden performance model (1984) is fairly sensitive to the imposed normalization restriction and that the suggested variation, however usually less robust than the original version, boasts higher performance when the normalization hypothesis is violated. Besides, it seems to be more capable of capturing intensely non-linear selection terms. Finally, through

<sup>2</sup> Please note that (3) is a special case of (4) for  $J(\eta_j) = \eta_j - E(\eta_j)$  and a normalization on the correlations, as Dubin and McFadden (1984) normalized errors whereas in (4) this normalization does not happen due to a non-linear J transformation.

<sup>3</sup> Observe that for each j, Bourguignon *et al.* (2004) assumed that expected values of  $u_1$  and  $\eta_j^*$  are linearly related, which is maintained through the classic hypothesis in which  $u_1$  is normal and  $(u_1, \eta_j^*)$  is bi-varied normal for any J alternative.

Monte-Carlo simulations, they concluded that the selection bias correction based on the *multinomial logit* model provides corrections that are good enough for the selection equation, even when the independence hypothesis of irrelevant alternatives (IIA) is violated.

## 5 DATABASE DESCRIPTIONS AND ANALYSIS

The database used was the Family Budget Research (FBR) 2002-2003 and 2008-2009 supplied by IBGE (Brazilian Institute of Geography and Statistics) for all rural Brazil states. From this database, variables related to the category “family reference person”, who corresponds to the household head, were obtained. The variable average rainfall was built based on information provided by INMET (National Meteorology Institute).

Initially, we use a multinomial logit model in which the dependent and explanatory variables are discriminated in Chart 1. This model estimates the marginal effects of response probabilities of working in the agricultural sector ( $P(ocup = 0)$ ), of working in the non-agricultural sector ( $P(ocup = 1)$ ), of working independently ( $P(ocup = 2)$ ) and of working in other employments ( $P(ocup = 3)$ ). The estimated results shall allow us to verify in which form explanatory variables affect personal occupational decisions in the labor market.

Additionally, these response probabilities shall be used to set factors or variables that correct the selection bias problem in the estimation of the income equation (5) as demonstrated in the previous section. In this second stage, the estimation of the income equation shall allow to verify the hypothesis of NPT existence.

**Chart 1. Description of variables for the Multinomial Logit**

| Dependent Variable                              | Description                     | Situation   |
|---|---------------------------------|---|
| Ocup  | Occupational decision           | 0 if working in the agricultural sector<br>1 if working in the non-agricultural sector<br>2 if working independently<br>3 if working in other employments |
| <b>Explanatory variables per family profile</b> |                                 |   |
| Idche   | Age of family                   | Numeric   |
| Idcheq  | Square age of family head       | Numeric   |
| adultm  | Nº adult men in the family      | Numeric   |
| tamfam  | Nº de family components         | Numeric   |
| adultf  | Nº de adult women in the family | Numeric   |
| Dsexo   | Sex <i>Dummy</i> of family head | 0 if female, 1 if male  |
| Pluv  | Average rainfall                | Numeric   |
| Litoral   | Localization <i>Dummy</i>       | 0 if state is not located on the coast<br>1 if state is located on the coast  |

Source: Data elaborated by the authors based on FBR data (2002-2003) and (2008-2009).

With these patterns, we estimated four income regressions using equation (5) in which dependent variables are the income of the *agricultural, non-agricultural, independent and other employment* sectors. The agricultural sector is composed of producers working in agricultural exploitation, farmers, mixed production entrepreneurs, tenants, marsh dwellers, rural workers, foremen, farmers, temporary rural employees and trainees.

The non-agricultural sector is composed of the extractive industry workers, civil construction and the textile, electronics and mechanics, iron and steel, food and drinks, tobacco, timber and real estate sectors; the military, the police, the fire brigade, public powers and corporate managers, technicians, salesmen, services providers, professors and public services employees.

The independent sector includes people who exploit their own undertakings, alone or with partners and without any employees, regardless of having or not a non-remunerated aid from a member of the family unit in their residence. It also includes the following industry sectors: trades, automotive, domestic services and repairs, oil retail traders, construction and other services. The “other employments” sector refers to the following categories: employers (a person who works exploiting his own business having at least one employee regardless of having or not the aid of a



non-remunerated worker from the family unit where he resides) and workers producing for their own consumption.

Besides the factors that correct the selection bias, the other explanatory variables used in the equation estimation (5) are described in Chart 2.

The choice of micronutrients was made based on their relevance in the Brazilian diet according to ANVISA (National Sanitary Control Agency). Average food prices were selected based on their importance in the Brazilian family budget: cereals and beans are the main items consumed, edible oil and sugar are intermediary goods and milk is a relatively luxury item for the poor.

**Charta 2. Description of variables for the second stage regression**

| Dependent Variable                              | Description   |
|---|---|
|   | Agricultural sector income  |
|   | Non-agricultural sector income  |
|   | Independent sector income   |
|   | Other employments income  |
| <b>Explanatory variables of family profiles</b> |   |
| idche   | Age of family head;   |
| idcheq  | Square age of family head   |
| adultm  | N° of male adults in the family   |
| adultf  | N° de female adults in the family   |
| tamfam  | N° de family members  |
| anest   | Average schooling years of family head  |
| Dsexo   | Sex <i>Dummy</i> of family head. 0 if female, 1 if male                         |
| <b>Other Explanatory Variables</b>              |   |
| calorie   | Amount of calories <i>per capita</i> consumed by the family head                |
| calorieq  | Amount of square calories <i>per capita</i> consumed by family head             |
| vitamB1   | Amount of vitamin B1 <i>per capita</i> consumed by family head                  |
| vitamB1q  | Amount of square vitamin B1 <i>per capita</i> consumed by family head           |
| vitamB2   | Amount of vitamin B2 <i>per capita</i> consumed by family head                  |
| vitamB2q  | Amount of square vitamin B2 <i>per capita</i> consumed by family head           |
| vitamA  | Amount of vitamin <i>per capita</i> consumed by family head                     |
| vitamAq   | Amount of square vitamin A <i>per capita</i> consumed by family head            |
| ferro   | Amount of iron per capita consumed by family head                               |
| ferroq  | Amount of square iron per capita consumed by family head                        |
| pcer  | Average price of cereals (rice, oat, wheat, rye, and by products)               |
| poleo   | Average price of edible oil   |
| pacuc   | Average price of sugar  |
| pfej  | Average price of beans  |
| pleit   | Average price of milk   |
| pluv  | Average rainfall  |
| litoral   | Localization <i>Dummy</i> : 0 if state is not located on the coast, 1 if it is. |

Source: Data elaborated by the authors based on FBR (2002-2003) and (2008-2009).

The explanatory variables for family profiles are commonly used in literature, such as the case of the household head age, average years of schooling, household head gender, the number of male and female adults, etc. Another explanatory variable used was the average rainfall, which is directly related to rural activities, as it can provoke from higher productivity to partial or total losses in a given harvest, thus affecting the search for employment in the sector. The control variable “localization of state in coastal areas or not” reflects the effects of the level of growth or economic stagnation. According to the specialized literature, this variable also affects the search for employment (JHA, GAIHA AND SHARMA, 2009).

It is important to highlight that the Family Budget Research – FBR, allows to indirectly evaluate food consumption tendencies through estimates of expenses made with the purchase of foods for household consumption and their market prices. However, this research has some limitations, once it does not permit to access information on individual consumption patterns.

Therefore, in order to establish the participation of each micronutrient in the total of foods consumed for each family and the total calorie intake per capita, we use a Food Nutrition Table provided by the IBGE. Studies on food consumption standards in Brazil are still scarce. The FBRs

of 2002-2003 and 2008-2009 are the only nationwide ones that include urban areas (Brazilian states and greater regions) and rural areas (Brazil and greater regions) available in the country.

## 6 RESULTS ANALYSIS

### 6.1 Results for Brazil using the FBR 2002-2003

#### 6.1.1 Multinomial logit results:

Table 1 introduces marginal effects obtained from the multinomial logit model estimated according to the specifications described in Chart 1.

**Table 1: Marginal effects for family head samples in rural Brazil (2002-2003).**

| variable | P(ocup=0) |       |        | P(ocup=1) |       |        | P(ocup=2) |       |        | P(ocup=3) |       |        |
|----------|-----------|-------|--------|-----------|-------|--------|-----------|-------|--------|-----------|-------|--------|
|          | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z   |
| idche    | -0.0156   | 0.002 | 0.0000 | 0.0099    | 0.003 | 0.0000 | 0.0073    | 0.003 | 0.0090 | -0.0016   | 0.002 | 0.3080 |
| idcheq   | 0.0001    | 0.000 | 0.0000 | -0.0002   | 0.000 | 0.0000 | 0.0000    | 0.000 | 0.8650 | 0.0001    | 0.000 | 0.0000 |
| adultm   | -0.0141   | 0.009 | 0.1050 | 0.0123    | 0.007 | 0.0990 | 0.0018    | 0.009 | 0.8460 | -0.0001   | 0.004 | 0.9860 |
| adultf   | -0.0356   | 0.010 | 0.0000 | 0.0450    | 0.008 | 0.0000 | -0.0076   | 0.011 | 0.4910 | -0.0018   | 0.005 | 0.7310 |
| tamfam   | -0.0022   | 0.003 | 0.4640 | -0.0199   | 0.003 | 0.0000 | 0.0158    | 0.004 | 0.0000 | 0.0063    | 0.002 | 0.0010 |
| Dsexo*   | 0.1901    | 0.011 | 0.0000 | -0.1726   | 0.019 | 0.0000 | 0.1171    | 0.020 | 0.0000 | -0.1346   | 0.017 | 0.0000 |
| pluv     | 1.42E-06  | 0.000 | 0.0000 | -1.12E-06 | 0.000 | 0.0000 | -2.43E-07 | 0.000 | 0.4200 | -6.45E-08 | 0.000 | 0.7600 |
| litoral  | -0.0632   | 0.010 | 0.0000 | -0.0068   | 0.009 | 0.4410 | 0.0334    | 0.012 | 0.0050 | 0.0366    | 0.006 | 0.0000 |

(\*) *dummy* variable and dy/dx represents a discrete change in the dummy variable from 0 to 1. Obs.: the significance level adopted was 5%.

Source: results obtained by the authors from NBR research 2002-2003.

Results suggest that the higher the age, the greater the probability of working in the non-agricultural and independent sectors. Provided we acknowledge that age represents years of experience, negative and significant square age values for the agricultural and non-agricultural sectors characterize a concave relation between experience and the increase in the probability of working in these sectors. In other words, more experience means higher chances of working in these sectors until a certain limit, from which opportunities tend to start diminishing. In the agricultural and non-agricultural sectors, the number of female adults in the family contributes to decrease the chances of being employed in 3.6% in the first sector and 4.5% in the second one. The number of male adults in the family does not affect employment chances in either sector.

The family size collaborates to decrease employment chances in the non-agricultural sector in 1.99%, however increasing in 1.6% and 0.63% in the independent and other employment sectors respectively. The male family head suffers a decrease of 17.3% and 13.5% in their employment opportunities in the non-agricultural and other employments sectors respectively when compared to females, however increasing in 19.01% and 11.71% their chances of being employed in the agricultural and independent sectors.

The average rainfall suggests a higher probability of working in agriculture and a lower chance for the non-agricultural sector. Finally, individuals who live in states located on the coast, have a higher chance of being employed in the independent and other employment sectors and a lower chance of working in the agricultural sector. Such variables have implications in the search for employment, as in general, coastal states have a better infrastructure and easier access to the labor market.

#### 6.1.2 Nutrition-Based Poverty Trap Estimation Results (NPT).

The results estimated in the model (5) to verify the hypothesis of NPT existence for the four sectors are entered in Tables A1 and A5. A positive and statistically significant sign of the estimated coefficient for a particular nutrient *per capita* variable and a negative and significant sign of the coefficient for that same square variable suggest the existence of NPT for that specific nutrient. For the estimated coefficient significant effects, we consider significance levels of 5% and

10%. In rural Brazil, according to Table A1, we observe the phenomenon of nutrition-based poverty trap for the case of calories in the agricultural, independent and other employment categories. According to data provided in Tables A2 and A3, we perceive that the nutrition-based poverty trap phenomenon is present for vitamins B1 and B2 in the agricultural, independent and other employment sectors, as the coefficients for these variables were positive and statistically significant. In table A4 we verify that workers in the non-agricultural, independent and other employments sectors are subject to the poverty trap with regards to vitamin A. As for nutrient iron, we can see that Table 5 shows that the agricultural, independent and other employments sectors are also subject to the poverty trap.

With regards to the other determinants, the estimated coefficient for the variable of average years of schooling was positive and significant in all regressions. This is a standard result observed in most empirical studies that correlate income and education. The coefficients for the price of sugar and oil obtained a negative and significant result for the regressions of vitamin B2 and iron (agricultural sector in Tables A3 and A5). As for the calorie regressions (agricultural sector in Table A1) the oil coefficient presented the same result. Nutritional deficiencies vary with food prices, as lower prices improve nutrition. For the other regressions, the price variable expressed a result that contradicted expectations.

The family profile variables, such as the number of male adults, showed a positive and significant result for the regressions of calories, vitamin B1, B2 and A and iron for the agricultural, independent and other employment categories, as shown in Tables A, A2, A3, A4 and A5 respectively. Results entered in Tables A1, A5, A2 and A4 suggest that the female adult variable boasted positive and significant results for the regressions of calories, iron and vitamins B1 and A for the independent sector and for vitamin B2 in the agricultural sector (Table A3). This means that a higher number of adults in the family working in these sectors will result in higher income for household heads. The family head age exerted a negative effect on income for the agricultural sector and this square variable had a positive impact on vitamin B2 regressions (agricultural sector, Table A3). This seems to suggest that workers in their initial stage of their labor lives earn less than after they reach a certain age and achieve some work experience.

The estimated coefficient for the coastal area variable was positive and significant in the regressions for calories, vitamins B1, B2 and A for the other employments category, as demonstrated by results shown on Tables A1, A2, A3 and A4. However, results from tables A3 and A5 show that the variable localization presented a negative and significant coefficient for the Vitamin B2 and iron regressions in the agricultural sector. This proves that agricultural workers located in coastal states tend to earn lower wages than workers in the other employments sector, possibly due to the fact that coastal states are more dynamic in economic terms. The average rainfall variable did not show any statistical significance for the agricultural sector in any of the analyzed regressions. In most of the studied regressions, some of the estimated coefficients for the variables  $m_0$ ,  $m_1$ ,  $m_2$  and  $m_3$  were statistically significant, thus showing that the selections bias correction was really necessary.

## **6.2 Results for Brazil using the FBR 2008-2009**

### **6.2.1 Multinomial Logit model Results**

Table 2 below shows the marginal effects obtained through the *multinomial logit* model estimated according to the specifications described in Chart 1.

**Table 2: marginal effects for family head samples in rural Brazil (2008-2009).**

| variable       | P(ocup=0) |       |        | P(ocup=1) |       |        | P(ocup=2) |       |        | P(ocup=3) |       |         |
|----------------|-----------|-------|--------|-----------|-------|--------|-----------|-------|--------|-----------|-------|---------|
|                | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z   | dy/dx     | Dp    | P> z    |
| <b>Idche</b>   | -0.0105   | 0.004 | 0.0090 | 0.0029    | 0.004 | 0.4860 | 0.0058    | 0.004 | 0.1420 | 0.0018    | 0.002 | 0.24000 |
| <b>Idcheq</b>  | 0.0001    | 0.000 | 0.1570 | -7.90E-05 | 0.000 | 0.0670 | 0.0000    | 0.000 | 0.7820 | 8.32E-06  | 0.000 | 0.54900 |
| <b>Adultm</b>  | 0.0675    | 0.015 | 0.0000 | 0.0171    | 0.016 | 0.2810 | -0.0655   | 0.016 | 0.0000 | -0.0192   | 0.007 | 0.00400 |
| <b>Adultf</b>  | -0.0492   | 0.019 | 0.0080 | 0.1255    | 0.019 | 0.0000 | -0.0796   | 0.020 | 0.0000 | 0.0033    | 0.007 | 0.61100 |
| <b>tamfam</b>  | 0.0036    | 0.007 | 0.6220 | -0.0349   | 0.008 | 0.0000 | 0.0313    | 0.008 | 0.0000 | 0.0001    | 0.003 | 0.98600 |
| <b>Dsexo*</b>  | 0.0699    | 0.028 | 0.0130 | -0.1106   | 0.031 | 0.0000 | 0.0478    | 0.029 | 0.0950 | -0.0072   | 0.012 | 0.53500 |
| <b>Pluv</b>    | 1.83E-06  | 0.000 | 0.0010 | -4.27E-07 | 0.000 | 0.4610 | -6.22E-07 | 0.000 | 0.2620 | -7.80E-07 | 0.000 | 0.00400 |
| <b>litoral</b> | -0.0571   | 0.021 | 0.0070 | 0.0308    | 0.021 | 0.1480 | 0.0174    | 0.022 | 0.4250 | 0.0089    | 0.009 | 0.29600 |

(\*) Dummy variable and dy/dx represents a discrete change in the dummy variable from 0 to 1. Obs.: the significance level adopted was 5%.

Source: results obtained by the authors based on data from POF 2008-2009.

According to the results entered in this table, in the agricultural sector, as an individual gets older, employment chances diminish. In this sector, age reduces employment opportunities in 1.05%. This shows that the older the age, the lower the chance to work in the farming sector, perhaps because agricultural activities demand more physical effort. This same result is not verified in other sectors. Still, in this area, the number of male adults in the family contributes to the chance of being employed in 6.75%. On the other hand, the number of female adults in the family contributes to reducing employment opportunities in 4.92% and 7.96% for the independent sector. This shows that female labor is associated to activities that demand less physical effort. On the other hand, in the non-agricultural sector the possibility for women to be employed grows in 12.55%.

The family size variable negatively affects employment chances in the non-agricultural sector in 3.49%, however increasing 3.13% in the independent sector. If compared to the female household head, the male head suffers a reduction of 11.06% in his chances to be employed in the non-farming sector and an increase of 6.99% in the farming sector. The average rainfall suggests a higher chance of working in agriculture and a lower chance of working in the non-agricultural and other employments categories. The coastal variable demonstrates that individuals located in coastal states have a lower probability of being employed in the farming sector, once coastal states in Brazil have a more developed economic infrastructure.

### 6.2.2 Nutrition-based Poverty Trap (NPT) Estimation Results

According to the results obtained from Tables A6 to A10, only the non-agricultural sector is subject to the poverty trap with regards to calories. In this same sector, the poverty trap is also verified for the iron micronutrient, according to results entered in Table A10. Analyzing results from Table A7, we corroborate that the poverty trap is present in the non-agricultural and independent sectors with regards to the vitamin B1 nutrient as well. In the farming sector, we noticed the poverty trap phenomenon for the vitamin B2 and iron nutrients, as shown in Table A8 and A10 respectively. Table A9 shows that workers in other employments are subject to the poverty trap related to a vitamin A deficiency. As for the other determinants, again, the average schooling years was positively correlated to income in all regressions and the average rainfall did not present any statistical significance in any of the studied sectors through all analyzed regressions. The price of oil showed a negative and significant result for the regressions of calories, iron, and vitamins B1 and A (independent sector, Table A8). The number of female adults in the family presented a positive and significant coefficient for the vitamin B2 regression in the agricultural sector, as expressed by the results in Table A8. Some estimated coefficients of variables 0, m1, m2 and m3 were statistically significant in several regressions, thus suggesting the need to correct the selection bias.

### 6.3 Summary of Results for the Nutrition-based Poverty Trap

**Table 3: Nutritional Poverty Trap for family head samples in rural Brazil**

| Micronutrients and calories |                                       |                               |
|-----------------------------|---------------------------------------|-------------------------------|
| Sectors                     | 2002-2003                             | 2008-2009                     |
| Agricultural                | Calories, vitamins B1 and B2, iron    | Iron and vitamin B2           |
| Non-agricultural            | Vitamin A                             | Calories, vitamin B1 and iron |
| Independent                 | Calories, vitamins B1, B2 and A, iron | Vitamin B1                    |
| Other Employments           | Calories, vitamins B, B2 and A, iron  | ----                          |

Source: results obtained by the authors based on data provided by POFs 2002-2003 and 2008-2009.

For rural Brazil, in the 2002-2003 period, the existence of NPT was verified for calories, iron and vitamins B1, B2 and A for workers in the independent and other employments categories. Employees of the agricultural sector obtained the same result, except for vitamin A. Workers in the non-agricultural sector are subject to the poverty trap only with regards to vitamin A. In the period from 2008 to 2009, NPT was proved for workers in the agricultural sector but only for iron and vitamin 2. Non-agricultural sector workers suffered the poverty trap for calories, vitamin B1 and iron. Self-employed workers suffered NPT related to vitamin B and workers in other employments did not suffer from NPT for calories or the other analyzed nutrients.

### 7 FINAL CONSIDERATIONS

The main goal of this study was to verify the existence of the nutrition-based poverty trap (NPT) analyzing the effects of micronutrient intake (calories, iron and vitamins A, B1 and B2) on income in rural Brazil, correcting the problem of endogeneity between these variables. Although micronutrient deficiencies still persist as a public health problem in Brazil, it is worth highlighting that there has been an NPT reduction in the studied period for most workers in the analyzed sectors, except for non-agricultural employees. The improvement in food consumption patterns in the Brazilian population is probably originated in the economic and social transformations that resulted in a reduction of poverty and malnutrition. Such facts suggest that the increase in family income among the poorest and the reduction of essential food prices would be effective ways to increase the intake of key nutrients in the diet of Brazilian families. These results agree with economics literature, which highlights that nutritional policies are essential for the reduction of extreme poverty and the acceleration of economic growth, as specialized economy and nutrition studies remark that healthy workers in better nutritional state are more productive at work.

Besides these public policies, it is worth mentioning the National Policy for Nutrition and Feeding, approved in 1999 by the Ministry of Health, which has as its main objective the promotion of food and nutrition safety for the Brazilian population. The Ministry of Health, Nutrition and Public Health Programs that seeks to reduce micronutrient deficiencies in the Brazilian population include vitamin A supplements, as well as ferrous sulphate for risk groups (babies, children and pregnant women); the fortification of foods such as wheat flour and corn with iron and folic acid and the addition of salt iodide for human consumption, as regulated by the National Agency of Sanitary Control (Anvisa) through the Fome Zero Project and the program to reduce iron deficiency anemia in Brazil, signed together with the food industry.

With regards to the explanatory variables that affect the occupational decision of agents in the labor market, we can infer that the older the age, the higher the probability of working outside the agricultural sector and in self-employment. This evidence confirms the traditional literature argument that older people have more difficulty getting jobs. Education measured through years of schooling strongly contributes to the increase in income in the four sectors analyzed: agricultural, non-agricultural, independent and other employments.

In this context, we remark the need for long-term national public policies that consider nutritional aspects and involve multiple initiatives such as raising more awareness among the target

populations, the regularity of food intake research, employment and income policies focused on the low-end income sector, reduction of food prices and support to the food farming industry and nutritional education initiatives.

We can therefore highlight the relevance of this study in the sense of offering a contribution to the economics and nutrition literature by quantifying the micronutrient and calorie deficiency in the progress of the nutrition-based poverty trap, and as a consequence, the impact of such deprivation in labor productivity, which emphasizes the importance of nutritional policies aimed at breaking this trap and reducing poverty in the rural areas of Brazil.

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## APPENDIX

## REGRESSIONS RESULTS USING A POF 2002-2003

Table A1. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of per capita calories per income category in rural Brazil (2002-2003)

| Variable     | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |             | Other Employments Income |                       |            |                       |
|--------------|---------------------|-----------------------|-------------------------|---------|------------------------|-------------|--------------------------|-----------------------|------------|-----------------------|
|              | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p     | Coef.                    | Value-p               |            |                       |
| calorie      | 2.10E-04            | 0.0000                | 9.94E-05                | 0.5220  | 1.18E-04               | 0.0000      | 2.00E-04                 | 0.0000                |            |                       |
| caloriesq    | -1.23E-11           | 0.0710                | 0.00                    | 0.9000  | -3.62E-12              | 0.2580      | -2.84E-11                | 0.0030                |            |                       |
| anest        | 66.59               | 0.0000                | 270.36                  | 0.0000  | 70.39                  | 0.0000      | 31.21                    | 0.0000                |            |                       |
| pcer         | 146.49              | 0.0000                | 48.99                   | 0.5480  | 95.62                  | 0.0020      | 15.65                    | 0.7340                |            |                       |
| pfeij        | 19.28               | 0.8110                | 156.89                  | 0.3750  | -2.83                  | 0.9560      | 96.08                    | 0.0670                |            |                       |
| poleo        | -177.09             | 0.0750                | -97.09                  | 0.7410  | -131.78                | 0.1240      | 172.27                   | 0.1670                |            |                       |
| pacuc        | -83.37              | 0.1420                | 254.75                  | 0.0220  | 85.53                  | 0.0090      | 123.02                   | 0.0270                |            |                       |
| pleit        | 443.73              | 0.0000                | 211.56                  | 0.2760  | 133.11                 | 0.0430      | 65.06                    | 0.3790                |            |                       |
| idche        | -75.50              | 0.1670                | 5.29                    | 0.9440  | -0.09                  | 0.9970      | 1.29                     | 0.9230                |            |                       |
| idcheq       | 1.05                | 0.0290                | 0.94                    | 0.5300  | 0.04                   | 0.8070      | -0.02                    | 0.7550                |            |                       |
| adulm        | 225.56              | 0.0010                | 50.66                   | 0.6280  | 92.43                  | 0.0010      | 93.06                    | 0.0000                |            |                       |
| adultf       | -60.69              | 0.5510                | 112.94                  | 0.6480  | 175.10                 | 0.0000      | 26.20                    | 0.3780                |            |                       |
| tamfam       | 22.87               | 0.6850                | 166.34                  | 0.3990  | 8.00                   | 0.7310      | 7.27                     | 0.6070                |            |                       |
| rain         | 0.00                | 0.8460                | 0.01                    | 0.2790  | 0.00                   | 0.1340      | -0.00                    | 0.3700                |            |                       |
| coast        | -251.34             | 0.2620                | 205.53                  | 0.6650  | 18.05                  | 0.8520      | 306.74                   | 0.0010                |            |                       |
| _m0          | -1284.24            | 0.2180                | -3055.95                | 0.5330  | -2459.09               | 0.1420      | 446.86                   | 0.6960                |            |                       |
| _m1          | -5223.85            | 0.0160                | -1651.54                | 0.5310  | -2394.49               | 0.1040      | 516.26                   | 0.5010                |            |                       |
| _m2          | -6063.85            | 0.0950                | -1165.98                | 0.7640  | -1333.35               | 0.0600      | -1.56                    | 0.9980                |            |                       |
| _m3          | -3204.35            | 0.4290                | 2784.75                 | 0.4130  | -2983.08               | 0.044       | -26.459                  | 0.931                 |            |                       |
| _cons        | -2691.80            | 0.011                 | -3889.5                 | 0.027   | -1483.1                | 0.389       | -872.23                  | 0.25                  |            |                       |
| N°obs.= 1875 |                     | R <sup>2</sup> = 0.12 | N°obs.= 1736            |         | R <sup>2</sup> = 0.27  | N°obs.=3953 |                          | R <sup>2</sup> = 0.09 | N°obs.=914 | R <sup>2</sup> = 0.21 |

Source: Results obtained by the authors based on data from POF 2002-2003.

Table A2. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of vitamin B1 per capita per income category in rural Brazil (2002-2003)

| Variable     | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |             | Other Employments Income |                       |            |                       |
|--------------|---------------------|-----------------------|-------------------------|---------|------------------------|-------------|--------------------------|-----------------------|------------|-----------------------|
|              | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p     | Coef.                    | Value-p               |            |                       |
| vitamB1      | 0.06                | 0.0400                | 0.02                    | 0.7300  | 0.06                   | 0.0020      | 0.18                     | 0.0000                |            |                       |
| vitamB1q     | -1.49E-06           | 0.0410                | 5.71E-08                | 0.9870  | -1.20E-06              | 0.0620      | -1.00E-05                | 0.0000                |            |                       |
| anest        | 54.30               | 0.0000                | 270.27                  | 0.0000  | 69.88                  | 0.0000      | 31.36                    | 0.0000                |            |                       |
| pcer         | 163.64              | 0.0000                | 41.54                   | 0.6110  | 85.40                  | 0.0060      | 22.49                    | 0.6200                |            |                       |
| pfeij        | 53.42               | 0.5300                | 150.75                  | 0.3930  | 0.55                   | 0.9910      | 95.48                    | 0.0650                |            |                       |
| poleo        | -130.55             | 0.1570                | -107.88                 | 0.7130  | -130.92                | 0.1270      | 143.45                   | 0.2400                |            |                       |
| pacuc        | -66.81              | 0.2760                | 258.40                  | 0.0200  | 89.86                  | 0.0060      | 88.15                    | 0.1130                |            |                       |
| pleit        | 429.97              | 0.0010                | 210.08                  | 0.2790  | 135.23                 | 0.0400      | 25.30                    | 0.7280                |            |                       |
| idche        | -86.94              | 0.1210                | 5.20                    | 0.9440  | 0.78                   | 0.9740      | -0.94                    | 0.9430                |            |                       |
| idcheq       | 1.12                | 0.0230                | 0.96                    | 0.5190  | 0.04                   | 0.8160      | -0.01                    | 0.8920                |            |                       |
| adulm        | 226.82              | 0.0010                | 53.48                   | 0.6080  | 92.12                  | 0.0010      | 92.76                    | 0.0000                |            |                       |
| adultf       | -74.93              | 0.4710                | 100.84                  | 0.6830  | 170.81                 | 0.0000      | 22.83                    | 0.4390                |            |                       |
| tamfam       | 0.31                | 0.9960                | 163.50                  | 0.4070  | 1.53                   | 0.9480      | 1.67                     | 0.9050                |            |                       |
| pluv         | -0.00               | 0.7690                | 0.01                    | 0.2690  | 0.00                   | 0.0920      | -0.00                    | 0.4280                |            |                       |
| litoral      | -202.21             | 0.3860                | 191.46                  | 0.6860  | 0.75                   | 0.9940      | 255.99                   | 0.0040                |            |                       |
| _m0          | -1072.48            | 0.3100                | -3058.10                | 0.5330  | -2529.13               | 0.1320      | 631.28                   | 0.5810                |            |                       |
| _m1          | -4690.03            | 0.0360                | -1674.83                | 0.5240  | -2411.54               | 0.1020      | 649.10                   | 0.3970                |            |                       |
| _m2          | -6444.13            | 0.0870                | -1169.23                | 0.7630  | -1354.93               | 0.0570      | -10.61                   | 0.9860                |            |                       |
| _m3          | -2858.12            | 0.4940                | 2874.91                 | 0.3970  | -3030.3                | 0.041       | 11.56                    | 0.97                  |            |                       |
| _cons        | -2576.51            | 0.016                 | -3756.78                | 0.032   | -1437.22               | 0.405       | -489.18                  | 0.515                 |            |                       |
| N°obs.= 1797 |                     | R <sup>2</sup> = 0.10 | N°obs.= 1736            |         | R <sup>2</sup> = 0.27  | N°obs.=3953 |                          | R <sup>2</sup> = 0.09 | N°obs.=914 | R <sup>2</sup> = 0.21 |

Source results obtained by the authors based on data from POF 2002-2003.



**Table A3. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of B2 vitamin per capita per income category in rural Brazil (2002-2003)**

| Variable | Agricultural Income |                       | Non-Agricultural income |                       | Self-employment Income |                       | Other Employments Income |                       |
|----------|---------------------|-----------------------|-------------------------|-----------------------|------------------------|-----------------------|--------------------------|-----------------------|
|          | Coef.               | Value-p               | Coef.                   | Value-p               | Coef.                  | Value-p               | Coef.                    | Value-p               |
| vitamB2  | 0.09                | 0.0010                | 0.06                    | 0.4510                | 0.10                   | 0.0000                | 0.21                     | 0.0000                |
| vitamB2q | -3.12e-06           | 0.0030                | 0.00                    | 0.7340                | -3.21E-06              | 0.0020                | -1.49E-05                | 0.0000                |
| anest    | 64.90               | 0.0000                | 269.63                  | 0.0000                | 68.70                  | 0.0000                | 30.31                    | 0.0000                |
| pcer     | 155.21              | 0.0000                | 40.34                   | 0.6210                | 86.87                  | 0.0050                | 21.75                    | 0.6340                |
| pfeij    | 26.86               | 0.7290                | 150.81                  | 0.3930                | 11.59                  | 0.8200                | 92.97                    | 0.0740                |
| poleo    | -213.90             | 0.0300                | -105.58                 | 0.7190                | -129.87                | 0.1290                | 150.49                   | 0.2230                |
| pacuc    | -114.79             | 0.0340                | 257.79                  | 0.0210                | 77.07                  | 0.0190                | 89.02                    | 0.1120                |
| pleit    | 425.58              | 0.0000                | 212.69                  | 0.2730                | 135.03                 | 0.0400                | 41.84                    | 0.5670                |
| idche    | -109.68             | 0.0250                | 4.83                    | 0.9480                | 0.18                   | 0.9940                | 0.93                     | 0.9440                |
| idcheq   | 1.30                | 0.0050                | 0.96                    | 0.5220                | 0.04                   | 0.8130                | -0.02                    | 0.7680                |
| adultm   | 210.71              | 0.0010                | 53.62                   | 0.6070                | 92.80                  | 0.0010                | 95.27                    | 0.0000                |
| adultf   | -74.42              | 0.4530                | 102.10                  | 0.6790                | 170.80                 | 0.0000                | 13.11                    | 0.6580                |
| tamfam   | -11.63              | 0.8160                | 163.78                  | 0.4050                | 4.22                   | 0.8560                | 4.99                     | 0.7210                |
| pluv     | 0.00                | 0.9980                | 0.01                    | 0.2660                | 0.00                   | 0.0880                | -0.00                    | 0.5610                |
| litoral  | -391.75             | 0.0340                | 190.09                  | 0.6880                | 6.12                   | 0.9500                | 262.89                   | 0.0040                |
| _m0      | -996.43             | 0.3250                | -3028.17                | 0.5360                | -2607.64               | 0.1200                | 510.04                   | 0.6550                |
| _m1      | -5209.94            | 0.0110                | -1665.75                | 0.5260                | -2458.08               | 0.0960                | 557.44                   | 0.4660                |
| _m2      | -7895.39            | 0.0090                | -1209.39                | 0.7550                | -1395.10               | 0.0500                | 38.57                    | 0.9480                |
| _m3      | -3391.20            | 0.3500                | 2851.02                 | 0.4010                | -3148.04               | 0.034                 | -26.621                  | 0.931                 |
| _cons    | -2435.29            | 0.012                 | -3778.22                | 0.031                 | -1484.81               | 0.388                 | -585.07                  | 0.437                 |
|          | N°obs.= 1916        | R <sup>2</sup> = 0.12 | N°obs.= 1736            | R <sup>2</sup> = 0.27 | N°obs.=3953            | R <sup>2</sup> = 0.09 | N obs.=914               | R <sup>2</sup> = 0.20 |

Source: results obtained by the authors based on data from POF 2002-2003.

**Table A4. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of vitamin A per capita per income category in rural Brazil (2002-2003)**

| Variable | Agricultural Income |                       | Non-Agricultural income |                       | Self-employment Income |                       | Other Employments Income |                       |
|----------|---------------------|-----------------------|-------------------------|-----------------------|------------------------|-----------------------|--------------------------|-----------------------|
|          | Coef.               | Value-p               | Coef.                   | Value-p               | Coef.                  | Value-p               | Coef.                    | Value-p               |
| vitamA   | 4.68E-05            | 0.5290                | 7.93E-04                | 0.0440                | 4.25E-04               | 0.0000                | 0.0004                   | 0.0000                |
| vitamAq  | -1.32E-12           | 0.5290                | -2.33E-10               | 0.0660                | -3.64E-11              | 0.0000                | -7.96E-11                | 0.0010                |
| anest    | 59.86               | 0.0000                | 267.35                  | 0.0000                | 68.62                  | 0.0000                | 31.5568                  | 0.0000                |
| pcer     | 125.66              | 0.0010                | 50.22                   | 0.5370                | 92.49                  | 0.0030                | 10.3883                  | 0.8220                |
| pfeij    | 18.58               | 0.8310                | 151.39                  | 0.3900                | -8.03                  | 0.8740                | 93.5672                  | 0.0760                |
| poleo    | -164.75             | 0.0790                | -98.72                  | 0.7360                | -128.76                | 0.1320                | 173.4329                 | 0.1650                |
| pacuc    | -32.23              | 0.5960                | 252.44                  | 0.0230                | 94.07                  | 0.0040                | 127.0358                 | 0.0230                |
| pleit    | 439.78              | 0.0010                | 218.17                  | 0.2600                | 155.30                 | 0.0180                | 71.5468                  | 0.3310                |
| idche    | -65.13              | 0.2430                | 8.96                    | 0.9040                | 3.17                   | 0.8960                | 5.1568                   | 0.7000                |
| idcheq   | 0.94                | 0.0520                | 0.83                    | 0.5770                | 0.03                   | 0.8830                | -0.0539                  | 0.5260                |
| adultm   | 245.63              | 0.0000                | 50.17                   | 0.6290                | 98.97                  | 0.0000                | 97.7041                  | 0.0000                |
| adultf   | -69.88              | 0.4880                | 110.49                  | 0.6530                | 171.76                 | 0.0000                | 19.6510                  | 0.5110                |
| tamfam   | 3.23                | 0.9550                | 152.32                  | 0.4370                | 3.51                   | 0.8810                | -0.2206                  | 0.9870                |
| pluv     | 0.00                | 0.8940                | 0.01                    | 0.2880                | 0.00                   | 0.0600                | -0.0016                  | 0.4570                |
| litoral  | -238.72             | 0.2980                | 168.34                  | 0.7210                | 12.73                  | 0.8960                | 308.3382                 | 0.0010                |
| _m0      | -1297.57            | 0.2130                | -2607.94                | 0.5920                | -2817.13               | 0.0960                | 397.1644                 | 0.7310                |
| _m1      | -4955.01            | 0.0260                | -1412.65                | 0.5900                | -2566.24               | 0.0840                | 565.2173                 | 0.4640                |
| _m2      | -5836.78            | 0.1190                | -1184.37                | 0.7580                | -1372.77               | 0.0560                | 163.7285                 | 0.7820                |
| _m3      | -3428.90            | 0.4000                | 2822.62                 | 0.4020                | -3240.95               | 0.03                  | -34.93929                | 0.91                  |
| _cons    | -2609.35            | 0.014                 | -3838.37                | 0.027                 | -1746.82               | 0.314                 | -787.88                  | 0.301                 |
|          | N°obs.= 1807        | R <sup>2</sup> = 0.09 | N°obs.= 1736            | R <sup>2</sup> = 0.26 | N° obs.=3953           | R <sup>2</sup> = 0.09 | N°obs.=914               | R <sup>2</sup> = 0.19 |

Source: results obtained by the authors based on data from POF 2002-2003.

**Table A5. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of iron per capita per income category in rural Brazil (2002-2003)**

| Variable                           | Agricultural Income |                                    | Non-Agricultural income |                                   | Self-employment Income |                                  | Other Employments Income |         |
|------------------------------------|---------------------|------------------------------------|-------------------------|-----------------------------------|------------------------|----------------------------------|--------------------------|---------|
|                                    | Coef.               | Value-p                            | Coef.                   | Value-p                           | Coef.                  | Value-p                          | Coef.                    | Value-p |
| ferro                              | 0.019               | 0.0000                             | 0.01                    | 0.3910                            | 0.01                   | 0.0000                           | 0.03                     | 0.0000  |
| ferroq                             | -7.69E-08           | 0.0000                             | -1.13E-07               | 0.5370                            | -7.60E-08              | 0.0280                           | -2.41E-07                | 0.0020  |
| anest                              | 58.61               | 0.0000                             | 269.90                  | 0.0000                            | 69.31                  | 0.0000                           | 31.99                    | 0.0000  |
| pcer                               | 145.40              | 0.0000                             | 43.81                   | 0.5910                            | 88.60                  | 0.0040                           | 24.12                    | 0.5950  |
| pfeij                              | 20.79               | 0.7830                             | 154.94                  | 0.3810                            | 11.40                  | 0.8240                           | 100.20                   | 0.0530  |
| poleo                              | -239.82             | 0.0230                             | -109.03                 | 0.7100                            | -135.90                | 0.1130                           | 170.40                   | 0.1660  |
| pacuc                              | -108.97             | 0.0310                             | 253.93                  | 0.0220                            | 81.61                  | 0.0130                           | 87.79                    | 0.1120  |
| pleit                              | 472.86              | 0.0000                             | 204.31                  | 0.2930                            | 127.59                 | 0.0530                           | 12.06                    | 0.8690  |
| idche                              | -83.05              | 0.0910                             | 3.98                    | 0.9580                            | 0.90                   | 0.9700                           | -2.31                    | 0.8600  |
| idcheq                             | 1.03                | 0.0190                             | 0.98                    | 0.5130                            | 0.04                   | 0.8420                           | -0.01                    | 0.9440  |
| adultm                             | 227.31              | 0.0000                             | 50.87                   | 0.6260                            | 91.01                  | 0.0010                           | 89.67                    | 0.0000  |
| adultf                             | -36.28              | 0.7070                             | 102.06                  | 0.6790                            | 171.75                 | 0.0000                           | 29.75                    | 0.3110  |
| tamfam                             | -9.30               | 0.8560                             | 166.14                  | 0.3990                            | 4.02                   | 0.8630                           | 4.75                     | 0.7320  |
| pluv                               | 0.00                | 0.8030                             | 0.01                    | 0.2630                            | 0.00                   | 0.1170                           | -0.00                    | 0.3730  |
| litoral                            | -410.08             | 0.0430                             | 192.91                  | 0.6840                            | 3.47                   | 0.9710                           | 266.61                   | 0.0030  |
| _m0                                | -1178.94            | 0.2350                             | -3091.39                | 0.5280                            | -2537.67               | 0.1300                           | 302.00                   | 0.7880  |
| _m1                                | -4702.08            | 0.0280                             | -1696.91                | 0.5190                            | -2393.89               | 0.1040                           | 473.05                   | 0.5300  |
| _m2                                | -6661.64            | 0.0450                             | -1186.60                | 0.7600                            | -1345.94               | 0.0580                           | -184.38                  | 0.7500  |
| _m3                                | -3826.95            | 0.3050                             | 2871.01                 | 0.3980                            | -3057.71               | 0.039                            | -110.56                  | 0.714   |
| _cons                              | -2179.68            | 0.035                              | -3760.23                | 0.032                             | -1455.11               | 0.398                            | -603.59                  | 0.419   |
| N°obs.= 2014 R <sup>2</sup> = 0.12 |                     | N°obs.= 1736 R <sup>2</sup> = 0.27 |                         | N°obs.=3953 R <sup>2</sup> = 0.09 |                        | N°obs.=914 R <sup>2</sup> = 0.22 |                          |         |

Source: results obtained by the authors based on data from POF 2002-2003.

## REGRESSIONS RESULTS USING POF 2008-2009

**Table A6. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of per capita calories per income category in rural Brazil (2008-2009).**

| Variable                          | Agricultural Income |                                   | Non-Agricultural income |                                  | Self-employment Income |                                 | Other Employments Income |         |
|-----------------------------------|---------------------|-----------------------------------|-------------------------|----------------------------------|------------------------|---------------------------------|--------------------------|---------|
|                                   | Coef.               | Value-p                           | Coef.                   | Value-p                          | Coef.                  | Value-p                         | Coef.                    | Value-p |
| caloria1                          | 0.00                | 0.4540                            | 0.01                    | 0.0280                           | 0.00                   | 0.8820                          | 0.00                     | 0.0280  |
| caloria1q                         | -3.77e-10           | 0.7030                            | -6.69e-09               | 0.1100                           | 6.72E-10               | 0.7390                          | 2.79E-09                 | 0.1100  |
| anest                             | 20.26               | 0.0000                            | 52.81                   | 0.0000                           | 20.62                  | 0.0140                          | 290.52                   | 0.0000  |
| pcer                              | 505.35              | 0.0250                            | 1926.02                 | 0.0040                           | -63.21                 | 0.8770                          | -1124.76                 | 0.0040  |
| pfeij                             | 179.17              | 0.0010                            | 298.65                  | 0.0350                           | 9.69                   | 0.9190                          | 219.11                   | 0.0350  |
| poleo                             | -142.41             | 0.3900                            | 197.89                  | 0.7030                           | -934.47                | 0.0030                          | -1713.01                 | 0.7030  |
| pacuc                             | 954.81              | 0.0020                            | 2755.49                 | 0.0010                           | 431.16                 | 0.4480                          | 4017.02                  | 0.0010  |
| pleit                             | -1596.02            | 0.0000                            | -2617.17                | 0.0020                           | -1079.36               | 0.0260                          | -3108.91                 | 0.0020  |
| idche                             | 70.74               | 0.4100                            | 204.04                  | 0.1400                           | 70.56                  | 0.5260                          | 282.56                   | 0.1400  |
| idcheq                            | -0.30               | 0.3610                            | -0.59                   | 0.5060                           | 0.11                   | 0.8210                          | -1.82                    | 0.5060  |
| adultm                            | -288.61             | 0.7260                            | -1008.91                | 0.4280                           | -687.72                | 0.5000                          | -817.79                  | 0.4280  |
| adultf                            | 719.20              | 0.0720                            | -355.42                 | 0.5910                           | 61.11                  | 0.9030                          | -1867.70                 | 0.5910  |
| tamfam                            | -62.98              | 0.7650                            | 310.20                  | 0.3570                           | 125.88                 | 0.6300                          | 541.28                   | 0.3570  |
| pluv                              | 0.00                | 0.6740                            | 0.01                    | 0.6330                           | 0.01                   | 0.6920                          | 0.01                     | 0.6330  |
| litoral                           | 290.48              | 0.4570                            | 601.77                  | 0.3530                           | 162.04                 | 0.7440                          | -1050.89                 | 0.3530  |
| _m0                               | -2149.01            | 0.3800                            | -15224.02               | 0.1530                           | -11603.81              | 0.2380                          | -11808.30                | 0.1530  |
| _m1                               | 2372.08             | 0.5150                            | -2844.43                | 0.3720                           | -6889.20               | 0.2180                          | -10965.77                | 0.3720  |
| _m2                               | 1742.76             | 0.8310                            | 5411.17                 | 0.6520                           | -473.29                | 0.8870                          | 4682.85                  | 0.6520  |
| _m3                               | 786.96              | 0.9050                            | 2392.66                 | 0.8090                           | -1038.84               | 0.819                           | -3998.05                 | 0.8090  |
| _cons                             | 1133.7              | 0.64                              | -15001.21               | 0.004                            | -4761.53               | 0.679                           | 1265.04                  | 0.004   |
| N°obs.= 557 R <sup>2</sup> = 0.22 |                     | N°obs.= 828 R <sup>2</sup> = 0.06 |                         | N°obs.=857 R <sup>2</sup> = 0.07 |                        | N°obs.=85 R <sup>2</sup> = 0.37 |                          |         |

Fonte: Resultados obtidos pelos autores a partir dos dados da POF 2008-2009.

**Table A7. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples – quantity of B1 vitamin per capita per income category in rural Brazil (2008-2009).**

| Variable    | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |            | Other Employments Income |                       |           |  |                       |
|-------------|---------------------|-----------------------|-------------------------|---------|------------------------|------------|--------------------------|-----------------------|-----------|--|-----------------------|
|             | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p    | Coef.                    | Value-p               |           |  |                       |
| vitamB1     | 0.96                | 0.2160                | 8.93                    | 0.0050  | 4.12                   | 0.0180     | 6.56                     | 0.3650                |           |  |                       |
| vitamB1q    | -0.00               | 0.4990                | -0.01                   | 0.0940  | -6.06E-03              | 0.0520     | -1.00E-03                | 0.9320                |           |  |                       |
| anest       | 19.10               | 0.0000                | 50.38                   | 0.0000  | 20.09                  | 0.0160     | 334.70                   | 0.0080                |           |  |                       |
| pcer        | 508.03              | 0.0260                | 1947.12                 | 0.0040  | -153.03                | 0.7070     | -604.09                  | 0.8150                |           |  |                       |
| pfej        | 186.15              | 0.0010                | 313.19                  | 0.0260  | 5.84                   | 0.9510     | 447.12                   | 0.3530                |           |  |                       |
| poleo       | -125.64             | 0.4690                | 39.36                   | 0.9400  | -931.58                | 0.0030     | -1100.10                 | 0.3560                |           |  |                       |
| pacuc       | 956.84              | 0.0020                | 2672.67                 | 0.0020  | 258.87                 | 0.6490     | 1179.54                  | 0.7180                |           |  |                       |
| pleit       | -1606.19            | 0.0000                | -2540.61                | 0.0020  | -929.41                | 0.0550     | -1684.00                 | 0.5960                |           |  |                       |
| idche       | 61.57               | 0.4800                | 209.51                  | 0.1340  | 79.68                  | 0.4750     | 350.30                   | 0.3140                |           |  |                       |
| idcheq      | -0.25               | 0.4490                | -0.50                   | 0.5720  | 0.10                   | 0.8370     | -1.52                    | 0.3660                |           |  |                       |
| adultm      | -238.19             | 0.7750                | -1174.09                | 0.3610  | -794.06                | 0.4340     | -1185.31                 | 0.7210                |           |  |                       |
| adultf      | 708.24              | 0.0800                | -457.40                 | 0.4930  | -14.09                 | 0.9770     | -2811.70                 | 0.0780                |           |  |                       |
| tamfam      | -62.87              | 0.7670                | 378.60                  | 0.2660  | 162.11                 | 0.5320     | 744.92                   | 0.3390                |           |  |                       |
| pluv        | 0.01                | 0.6470                | 0.01                    | 0.5920  | 0.01                   | 0.6310     | -0.01                    | 0.8680                |           |  |                       |
| litoral     | 281.38              | 0.4750                | 601.57                  | 0.3570  | 195.11                 | 0.6930     | -410.28                  | 0.8190                |           |  |                       |
| _m0         | -2130.15            | 0.3830                | -16335.58               | 0.1290  | -12052.94              | 0.2180     | -3874.04                 | 0.9140                |           |  |                       |
| _m1         | 2249.98             | 0.5390                | -3080.27                | 0.3360  | -6947.60               | 0.2100     | -12024.30                | 0.5520                |           |  |                       |
| _m2         | 1435.27             | 0.8620                | 6196.90                 | 0.6100  | -83.61                 | 0.9800     | 10667.96                 | 0.5610                |           |  |                       |
| _m3         | -536.80             | 0.9410                | 2965.88                 | 0.7660  | -708.15                | 0.875      | 81.48                    | 0.993                 |           |  |                       |
| _cons       | 976.35              | 0.693                 | -14896.75               | 0.005   | -5723.16               | 0.618      | -8728.18                 | 0.811                 |           |  |                       |
| N°obs.= 555 |                     | R <sup>2</sup> = 0.22 | N°obs.= 828             |         | R <sup>2</sup> = 0.07  | N°obs.=857 |                          | R <sup>2</sup> = 0.07 | N°obs.=88 |  | R <sup>2</sup> = 0.36 |

Source: results obtained by the authors based on data from POF 2008-2009.

**Table A8. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of B2 vitamin per capita per income category in rural Brazil (2008-2009).**

| Variable    | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |            | Other Employments Income |                       |            |  |                       |
|-------------|---------------------|-----------------------|-------------------------|---------|------------------------|------------|--------------------------|-----------------------|------------|--|-----------------------|
|             | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p    | Coef.                    | Value-p               |            |  |                       |
| vitamB2     | 1.98                | 0.0030                | 0.06                    | 0.4510  | 1.86                   | 0.1120     | -5.34                    | 0.2820                |            |  |                       |
| vitamB2q    | -0.00               | 0.0110                | 0.00                    | 0.7340  | -1.30E-03              | 0.3880     | 1.54E-02                 | 0.0080                |            |  |                       |
| anest       | 26.88               | 0.0000                | 269.63                  | 0.0000  | 19.90                  | 0.0180     | 314.98                   | 0.0060                |            |  |                       |
| pcer        | 339.70              | 0.1550                | 40.34                   | 0.6210  | -123.08                | 0.7630     | -3477.80                 | 0.1110                |            |  |                       |
| pfej        | 232.08              | 0.0000                | 150.81                  | 0.3930  | -3.89                  | 0.9670     | 345.07                   | 0.4310                |            |  |                       |
| poleo       | -361.28             | 0.0400                | -105.58                 | 0.7190  | -959.74                | 0.0020     | -1045.96                 | 0.3600                |            |  |                       |
| pacuc       | 530.68              | 0.0980                | 257.79                  | 0.0210  | 322.69                 | 0.5710     | -2173.14                 | 0.4010                |            |  |                       |
| pleit       | -1553.22            | 0.0000                | 212.69                  | 0.2730  | -920.61                | 0.0600     | 1523.44                  | 0.5570                |            |  |                       |
| idche       | 45.03               | 0.6140                | 4.83                    | 0.9480  | 71.45                  | 0.5220     | 390.64                   | 0.2250                |            |  |                       |
| idcheq      | -0.07               | 0.8270                | 0.96                    | 0.5220  | 0.12                   | 0.8030     | -0.87                    | 0.5180                |            |  |                       |
| adultm      | -314.55             | 0.7120                | 53.62                   | 0.6070  | -726.69                | 0.4760     | -2237.12                 | 0.4610                |            |  |                       |
| adultf      | 875.58              | 0.0350                | 102.10                  | 0.6790  | 22.91                  | 0.9630     | -1385.86                 | 0.3310                |            |  |                       |
| tamfam      | -55.04              | 0.8030                | 163.78                  | 0.4050  | 145.87                 | 0.5750     | 508.51                   | 0.4650                |            |  |                       |
| pluv        | 0.02                | 0.2030                | 0.01                    | 0.2660  | 0.01                   | 0.6620     | 0.01                     | 0.8450                |            |  |                       |
| litoral     | 299.89              | 0.4540                | 190.09                  | 0.6880  | 158.26                 | 0.7490     | 524.13                   | 0.7600                |            |  |                       |
| _m0         | -4545.35            | 0.0660                | -3028.17                | 0.5360  | -11873.13              | 0.2270     | -30226.91                | 0.3590                |            |  |                       |
| _m1         | 848.36              | 0.8110                | -1665.75                | 0.5260  | -7051.63               | 0.2070     | -15431.14                | 0.3760                |            |  |                       |
| _m2         | 1137.04             | 0.8950                | -1209.39                | 0.7550  | -412.50                | 0.9010     | 11676.97                 | 0.4700                |            |  |                       |
| _m3         | -14892.76           | 0.0230                | 2851.02                 | 0.4010  | -1015.50               | 0.823      | 135.61                   | 0.986                 |            |  |                       |
| _cons       | 2503.44             | 0.32                  | -3778.22                | 0.031   | -5050.51               | 0.661      | -14631.18                | 0.641                 |            |  |                       |
| N°obs.= 558 |                     | R <sup>2</sup> = 0.43 | N°obs.= 1736            |         | R <sup>2</sup> = 0.28  | N°obs.=857 |                          | R <sup>2</sup> = 0.07 | N° obs.=88 |  | R <sup>2</sup> = 0.46 |

Source: results obtained by the authors based on data from POF 2008-2009.

**Table A9. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples – quantity of vitamin A per capita per income category in rural Brazil (2008-2009).**

| Variable    | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |             | Other Employments Income |                       |            |  |                       |
|-------------|---------------------|-----------------------|-------------------------|---------|------------------------|-------------|--------------------------|-----------------------|------------|--|-----------------------|
|             | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p     | Coef.                    | Value-p               |            |  |                       |
| vitamA      | 0.00                | 0.7270                | 0.00                    | 0.6090  | 0.00                   | 0.6840      | 0.03                     | 0.0100                |            |  |                       |
| vitamAq     | 0.00                | 0.4880                | 0.00                    | 0.6860  | -3.45E-11              | 0.9550      | -7.05E-08                | 0.0180                |            |  |                       |
| Anest       | 20.29               | 0.0000                | 52.82                   | 0.0000  | 20.88                  | 0.0140      | 310.34                   | 0.0600                |            |  |                       |
| pcer        | 523.66              | 0.0210                | 1838.84                 | 0.0060  | -56.01                 | 0.8930      | -532.03                  | 0.8330                |            |  |                       |
| pfeij       | 222.54              | 0.0000                | 287.79                  | 0.0430  | 12.48                  | 0.8970      | 556.83                   | 0.2830                |            |  |                       |
| poleo       | -173.24             | 0.3230                | 216.87                  | 0.6760  | -949.64                | 0.0030      | -1911.65                 | 0.1670                |            |  |                       |
| pacuc       | 990.10              | 0.0010                | 2704.86                 | 0.0020  | 439.79                 | 0.4450      | 402.61                   | 0.8950                |            |  |                       |
| pleit       | -1643.01            | 0.0000                | -2544.94                | 0.0020  | -1082.63               | 0.0280      | -1238.38                 | 0.6860                |            |  |                       |
| idche       | 45.24               | 0.5830                | 190.01                  | 0.1620  | 59.72                  | 0.5770      | 481.52                   | 0.2350                |            |  |                       |
| idcheq      | -0.26               | 0.3960                | -0.64                   | 0.4650  | 0.01                   | 0.9850      | -2.10                    | 0.3590                |            |  |                       |
| adultm      | -60.26              | 0.9380                | -747.86                 | 0.5490  | -462.93                | 0.6350      | -2161.39                 | 0.5750                |            |  |                       |
| adultf      | 479.40              | 0.1980                | -116.10                 | 0.8570  | 184.59                 | 0.6990      | -1409.13                 | 0.3760                |            |  |                       |
| tamfam      | -12.57              | 0.9490                | 155.70                  | 0.6350  | 45.46                  | 0.8540      | 592.73                   | 0.5080                |            |  |                       |
| pluv        | 0.01                | 0.4660                | 0.00                    | 0.8130  | 0.00                   | 0.8130      | 0.03                     | 0.7720                |            |  |                       |
| litoral     | 122.10              | 0.7460                | 530.07                  | 0.4070  | 78.38                  | 0.8700      | 609.81                   | 0.7500                |            |  |                       |
| _m0         | -3240.22            | 0.1450                | -13337.04               | 0.2030  | -9571.95               | 0.3110      | -21954.08                | 0.5940                |            |  |                       |
| _m1         | -2567.34            | 0.4380                | -2201.55                | 0.4830  | -5578.33               | 0.3010      | 3023.19                  | 0.9050                |            |  |                       |
| _m2         | -1428.77            | 0.8550                | 3853.36                 | 0.7430  | -901.52                | 0.7770      | 25791.96                 | 0.2300                |            |  |                       |
| _m3         | -8208.03            | 0.2200                | 2505.33                 | 0.7980  | -1285.92               | 0.771       | 2316.90                  | 0.832                 |            |  |                       |
| _cons       | -1124.40            | 0.634                 | -13365.4                | 0.01    | -2329.55               | 0.833       | -10043.68                | 0.819                 |            |  |                       |
| N°obs.= 569 |                     | R <sup>2</sup> = 0.21 | N° obs.= 828            |         | R <sup>2</sup> = 0.054 | N° obs.=857 |                          | R <sup>2</sup> = 0.07 | N° obs.=85 |  | R <sup>2</sup> = 0.29 |

Source results obtained by the authors based on data from POF 2008-2009.

**Table 10. 2<sup>nd</sup> stage regression for the selection bias correction for family head samples - quantity of iron per capita per income category in rural Brazil (2008-2009).**

| Variable    | Agricultural Income |                       | Non-Agricultural income |         | Self-employment Income |             | Other Employments Income |                       |            |  |                       |
|-------------|---------------------|-----------------------|-------------------------|---------|------------------------|-------------|--------------------------|-----------------------|------------|--|-----------------------|
|             | Coef.               | Value-p               | Coef.                   | Value-p | Coef.                  | Value-p     | Coef.                    | Value-p               |            |  |                       |
| ferro       | 0.22                | 0.0190                | 0.81                    | 0.0200  | 0.09                   | 0.5880      | 1.95                     | 0.1080                |            |  |                       |
| ferroq      | -2.94E-05           | 0.0650                | -1.42E-04               | 0.0560  | -1.01E-05              | 0.7420      | -2.76E-04                | 0.1780                |            |  |                       |
| anest       | 18.98               | 0.0000                | 53.73                   | 0.0000  | 20.85                  | 0.0130      | 350.67                   | 0.0050                |            |  |                       |
| pcer        | 436.27              | 0.0620                | 1848.01                 | 0.0060  | -75.22                 | 0.8550      | -888.50                  | 0.7410                |            |  |                       |
| pfeij       | 201.20              | 0.0000                | 275.30                  | 0.0530  | 2.52                   | 0.9790      | 243.30                   | 0.6550                |            |  |                       |
| poleo       | -235.41             | 0.1790                | 154.15                  | 0.7670  | -929.01                | 0.0030      | -1757.26                 | 0.2290                |            |  |                       |
| pacuc       | 884.51              | 0.0060                | 2605.69                 | 0.0030  | 372.81                 | 0.5220      | 1685.27                  | 0.6260                |            |  |                       |
| pleit       | -1643.93            | 0.0000                | -2432.59                | 0.0040  | -1017.58               | 0.0400      | -2471.59                 | 0.4590                |            |  |                       |
| idche       | 97.44               | 0.2600                | 205.85                  | 0.1380  | 64.98                  | 0.5510      | 13.24                    | 0.9740                |            |  |                       |
| idcheq      | -0.11               | 0.7350                | -0.59                   | 0.5080  | 0.07                   | 0.8880      | -0.48                    | 0.7820                |            |  |                       |
| adultm      | -726.21             | 0.3800                | -1015.69                | 0.4270  | -586.21                | 0.5570      | 666.21                   | 0.8590                |            |  |                       |
| adultf      | 167.14              | 0.6620                | -307.46                 | 0.6430  | 118.99                 | 0.8080      | -2730.07                 | 0.1210                |            |  |                       |
| tamfam      | 190.79              | 0.3570                | 288.65                  | 0.3940  | 87.89                  | 0.7310      | 689.75                   | 0.4090                |            |  |                       |
| pluv        | 0.02                | 0.1590                | 631.83                  | 0.3320  | 0.00                   | 0.7460      | 0.02                     | 0.7840                |            |  |                       |
| litoral     | 392.10              | 0.3230                | 0.01                    | 0.6500  | 129.14                 | 0.7910      | -1544.24                 | 0.4820                |            |  |                       |
| _m0         | -5279.46            | 0.0240                | -14975.58               | 0.1610  | -10553.72              | 0.2740      | 4330.98                  | 0.9050                |            |  |                       |
| _m1         | -5542.58            | 0.0950                | -2600.19                | 0.4170  | -6149.46               | 0.2630      | -14162.02                | 0.5060                |            |  |                       |
| _m2         | 2586.92             | 0.7560                | 5791.23                 | 0.6300  | -647.46                | 0.8420      | -912.62                  | 0.9560                |            |  |                       |
| _m3         | -4535.12            | 0.4910                | 2872.69                 | 0.7730  | -1001.06               | 0.823       | -6818.673                | 0.519                 |            |  |                       |
| _cons       | -569.77             | 0.818                 | -14400.69               | 0.006   | -3566.12               | 0.752       | 15465.12                 | 0.726                 |            |  |                       |
| N°obs.= 563 |                     | R <sup>2</sup> = 0.24 | N°obs.= 828             |         | R <sup>2</sup> = 0.06  | N° obs.=857 |                          | R <sup>2</sup> = 0.07 | N° obs.=83 |  | R <sup>2</sup> = 0.47 |

Source: results obtained by the authors based on date from POF 2008-2009.