# Modelling the supply of informal work 

a microeconometric approach

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## Motivation

- With more than half the workforce in the informal sector in Latin-American economies, understanding the nature of informality is critical
- If markets are segmented (i.e there are significant barriers to become formal) distortions in the formal sector are indeed large and the need for reform is compelling
- If informal workers' dynamics are similar to the formal sector, the focus shifts towards the cost-benefit analysis agents undertake choosing among sectors


## Earnings distribution of formal and informal employees (2014)


*minimum wage vertical dotted line Source: Author's calculations

- To what extent barriers to enter the formal sector affect labour supply and sector choice?
- What would be the sectoral choice responses of informal workers to exogenous changes in tax-benefit system rules or education level?


## Literature Review

- Informality Choice
- Macroeconomic and Growth models with two sectors
- Raush (1991), Loayza (1996), Amaral and Quintin (2006), Loayza and Rigolini (2011), De Paula and Scheinkman (2011), Galiani and Weinschelbaum (2012)
- Search and Matching Models
- Zenou (2008), Albrecht, Navarro and Vroman (2009), Bosch and Maloney (2010)
- Labour supply with informality
- Too few microeconometric studies
- Pradhan and Van Soest (1997) Labour supply and sector choice of two spouses households in Bolivia (ordered vs multinomial models)
- Gong, Van Soest and Villagomez (2004) study formality, informality or non-participation choice in Mexico with a dynamic multinomial logit panel data model


## Current labour supply models

Following Aaberge and Colombino (2014) modern labour supply models can be classified in two groups:

- Discrete Choice Models (DC)
- Random Utility-Random Opportunity (RURO)


## Discrete Choice Model (DC) aka Van Soest model (VS)

- Choice set of hours of worked consists of only k discrete alternatives $\mathrm{L}_{\mathrm{i}} \in[0, \mathrm{~T}] \forall \mathrm{i}=1,2, \ldots \mathrm{k}$
- Stochastic utility function over only one Consumption good (disposable income) and Leisure

$$
\mathrm{U}_{\mathrm{i}}=\mathrm{V}\left(\mathrm{C}_{\mathrm{i}}, \mathrm{~T}-\mathrm{L}_{\mathrm{i}} \mid \mathrm{X}\right)+\varepsilon_{\mathrm{i}}
$$

- X Individual measured characteristics such as age, gender, education or number of kids etc., that could directly affect preferences or indirectly affect disposable income (through tax and benefit rules)
- Function $\mathrm{f}($.$) translates each element in the discrete set of$ hours worked into disposable income for that choice, by adding benefits and subtracting taxes and social insurance (TB) from labour ( $\mathrm{wL}_{\mathrm{i}}$ ) and non-labour ( $\overline{\mathrm{Y}}_{\mathrm{i}}$ ) original income

$$
Y_{i}=C_{i}=f\left(L_{i} \mid X\right)=w L_{i}+\bar{Y}_{i}+T B\left(w L_{i}+\bar{Y}_{i} \mid X\right)
$$

- Calculated with tax-benefit microsimulation models
- Assuming $\varepsilon_{i}$ is an error term with an Extreme value distribution the individual likelihood takes the multinomial logit form ( $\mathrm{L}_{\mathrm{i}}$ observed choice):

$$
p_{i}\left(L_{i} \mid X\right)=\frac{e^{v\left(L_{i} \mid X\right)}}{\sum_{j=1}^{k} e^{v\left(L_{j} \mid X\right)}}
$$

- For non-workers wages are imputed
- For couples a unitary decision household is usually assumed, utility depends on individual labour supply but household disposable income
- The model may require some fixed utility costs of working to improve fit (Van Soest,1995)


## Random Utility-Random Opportunity Models (RURO)

- Intuition 1: Wages are not fixed but part of the job offer alongside the time regime.
- Intuition 2: Utilities are weighted with the intensity with which job offers are made available to each agent
- Each job offer is a bundle consisting of working time to be supplied $\left(\mathrm{L}_{\mathrm{i}}\right)$ and a wage to be paid by the employer $\left(\mathrm{w}_{\mathrm{i}}\right)$.
- Each non-market activity is assumed to offer a wage $\mathrm{w}_{\mathrm{i}}=0$ and to require no hours of work $\mathrm{L}_{\mathrm{i}}=0$
- The arrival of job offers depends on personal characteristics, labour demand conditions, the wage and time regime the job offer stipulates.
- Arrival modelled by a Poisson process with intensity parameter given by

$$
\lambda_{1}\left(\varepsilon_{i}, q\right) g_{1}\left(w_{i}\right) g_{2}\left(L_{i}\right)
$$

- The opportunities function $\lambda_{1}$ captures labour demand conditions given by $q=\exp \left(\beta_{q} X_{q}\right)$
- $g_{1}$ is the density (lognormal) of jobs paying wages $w_{i}$ which is assumed to depend on some covariates.
- $\mathrm{g}_{2}$ is the density (assumed piecemeal uniform with peaks in the most frequently observed time regimes) of jobs requiring $L_{i}$ hours of work
- The resulting probability that the chosen time regime $\mathrm{L}_{\mathrm{i}}$ and wage $w_{i}$ are the observed for individual i observed working is given by

$$
p_{i}\left(w_{i}, L_{i}\right)=\frac{q g_{1}\left(w_{i}\right) g_{2}\left(L_{i}\right) e^{V\left(w_{i}, L_{i}\right)}}{e^{V(0,0)}+\int_{w_{i} \in W} \int_{L_{k} \in \mathbb{E}} q g_{1}\left(w_{j}\right) g_{2}\left(L_{k}\right) e^{v\left(w_{j} L_{k}\right)} d L_{k} d w_{j}}
$$

For non participation

$$
p_{i}(0,0)=\frac{e^{V(0,0)}}{e^{V(0,0)}+\int_{w_{j} \in W} \int_{L_{k} \in \mathbb{I}} q g_{1}\left(w_{j}\right) g_{2}\left(L_{k}\right) e^{v\left(w_{j} L_{k}\right)} d L_{k} d w_{j}}
$$

Where $\mathbb{W}$ and $\mathbb{H}$ are the sets of wage offers and hours supplied respectively which are not observed (Decoster et al., 2016)

## Labour supply of informal work

- We extend RURO to take into account sectoral choice assuming that job offer intensities, and wage and hour densities are different for informal and formal workers.
- The resulting individual likelihood is given by

$$
q_{z} g_{1 \mathrm{k}}\left(w_{i}\right) g_{2 k}\left(L_{i}\right) e^{V\left(w_{i}, L_{i}, z_{i}\right)}
$$

$p_{i}\left(w_{i}, L_{i}, z_{i}\right)=$

$$
e^{V(0,0,0)}+\sum_{k=0}^{1} \int_{w_{j} \in \mathbb{W}} \int_{L_{k} \in \mathbb{H}} q_{z} g_{1 z}\left(w_{j}\right) g_{2 z}\left(L_{k}\right) e^{V\left(w_{j}, L_{k}, z_{i}\right)} d L_{k} d w_{j}
$$

For non participation

$$
\mathrm{e}^{\mathrm{V}(0,0,0)}
$$

$$
\mathrm{p}_{\mathrm{i}}(0,0,0)=
$$

$$
e^{V(0,0,0)}+\sum_{k=0}^{1} \int_{w_{j} \in \mathbb{W}} \int_{L_{k} \in \mathbb{H}} q_{z} g_{1 z}\left(w_{j}\right) g_{2 z}\left(L_{k}\right) e^{V\left(w_{j}, L_{k}, z_{i}\right)} d L_{k} d w_{j}
$$

To estimate the model we drawn from a priory density functions. The simulated likelihood for the observed time regime $\mathrm{L}_{\mathrm{i}}$ and wage $w_{i}$ is

$$
\frac{\mathbb{P}(0,0,0)}{\mathbb{P}\left(w_{i}, L_{i}, z_{i}\right)} q_{z} g_{1 z}\left(w_{i}\right) g_{2 z}\left(L_{i}\right) e^{v\left(w_{i}, L_{i}, z_{i}\right)}
$$

$\mathrm{p}_{\mathrm{i}}\left(\mathrm{w}_{\mathrm{i}}, \mathrm{L}_{\mathrm{i}}, \mathrm{z}_{\mathrm{i}}\right)=$

$$
\mathrm{e}^{\mathrm{v}(0,0,0)}+\sum_{w_{j}, L_{k} z_{\mathrm{k}} \in \mathbb{D}} \frac{\mathbb{P}(0,0,0)}{\mathbb{P}\left(w_{j}, L_{k}, z_{n}\right)} q_{n} g_{1 n}\left(w_{j}\right) g_{2 n}\left(L_{k}\right) e^{v\left(w_{j}, L_{k}, z_{n}\right)}
$$

For non participation

$$
\mathrm{e}^{\mathrm{V}(0,0,0)}
$$

$p_{i}\left(w_{i}, L_{i}, z_{i}\right)=$

$$
e^{\mathrm{v}(0,0,0)}+\sum_{w_{j}, L_{k} z_{n} \in \mathbb{D}} \frac{\mathbb{P}(0,0,0)}{\mathbb{P}\left(w_{j}, L_{k}, z_{n}\right)} q_{n} g_{1 n}\left(w_{j}\right) g_{2 n}\left(L_{k}\right) e^{v\left(w_{j}, L_{k}, z_{n}\right)}
$$

The probability of a job offer being drawn is included in the model $\left(\frac{\mathbb{P}(0,0,0)}{\mathbb{P}\left(w_{;} \mathrm{L}_{\mathrm{k}}, \mathrm{z}_{\mathrm{i}}\right)}\right)$ and the observed choice must be included in the $\mathbb{D}$ subset (Train, 2009).

- For the three models the systematic part of the utility function is of the Box-Cox type

$$
\mathrm{V}\left(\mathrm{C}_{\mathrm{i}}, \mathrm{~T}-\mathrm{L}_{\mathrm{i}} \mid \mathrm{X}\right)=\mathrm{V}\left(\mathrm{w}_{\mathrm{i}}, \mathrm{~L}_{\mathrm{i}}\right)=\left(\beta_{\mathrm{H}}^{\prime} \mathrm{X}_{\mathrm{H}}\right)\left(\frac{\left(\frac{\left.\mathrm{T}-\mathrm{L}_{\mathrm{i}}\right)^{\alpha_{H}}}{\mathrm{~T}}-1\right.}{\alpha_{\mathrm{H}}}\right)+\left(\beta_{\mathrm{Y}}^{\prime} \mathrm{X}_{\mathrm{Y}}\right)\left(\frac{\mathrm{Y}_{\mathrm{i}}{ }^{\alpha_{\mathrm{X}}-1}}{\alpha_{\mathrm{Y}}}\right)
$$

- $\mathrm{X}_{\mathrm{H}}$ and $\mathrm{X}_{\mathrm{Y}}$ are a vector of parameters that shift the intensity of preference for leisure and income
- $\alpha_{H}$ and $\alpha_{Y}<1$ determine the curvature of the indifference curves
- lower values imply less substitutability between leisure and income.
- Hours density piecemeal uniform (Only for RURO type)

- Quality of Life National Survey (ENCV)
- Income and Expenditure Household Survey for Colombia 2014
- Cross Section
- 67.332 observations
- We focus on singles aged 18-60 years, not in education or disabled and in urban areas
- They must be living without other working age family members
- They are either working as employees (formal or informal) or not working i.e self-employed are excluded
- If working, they report only one job
- 697 observations


## Results

## Preferences

RURO and VS Indifference Curves for:CO


|  | VS |  |  | RURO |  | RURO_OC |  |
| :---: | :--- | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Variable | coef. | t-value | coef. | t-value | coef. | t-value |
|  | leisureXconst | 5.49 | 0.38 | 4.48 | 0.27 | 0.21 | 0.18 |
| leisure_male | -0.50 | -1.94 | -0.68 | -1.76 | -0.01 | -0.47 |  |
| leisure_age | -2.56 | -0.31 | -2.28 | -0.24 | -0.16 | -0.23 |  |
| leisure_age2 | 0.48 | 0.42 | 0.46 | 0.34 | 0.03 | 0.33 |  |
| ¿ leisure_child02 | 0.23 | 0.43 | 0.64 | 1.03 | 0.13 | 0.92 |  |
| leisure_child34 | -0.31 | -0.70 | -0.45 | -0.91 | 0.01 | 0.18 |  |
| leisure_child512 | 0.55 | 1.67 | 0.25 | 0.66 | 0.09 | 1.29 |  |
| alfa_leisure | -2.17 | -6.48 | -1.67 | -2.92 | -5.41 | -5.04 |  |
| incomeXconst | 2.30 | 10.96 | 1.07 | 5.48 | 0.00 | 0.21 |  |
| alfa_income | -0.36 | -6.04 | -0.29 | -3.36 | -3.19 | -1.85 |  |
| fcXconst | 42.94 | 1.97 |  |  |  |  |  |
| fcXchild02 | 0.69 | 1.43 |  |  |  |  |  |
| fcXage | -23.33 | -1.93 |  |  |  | Sour |  |
| fcXage2 | 3.29 | 1.96 |  |  |  |  |  |

Source: Author's calculations

## Wages

|  | Variable | vs |  | RURO |  | RURO_OC |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | coef. | t-value | coef. | t-value | coef. | t-value |
| 㐫 | w_const |  |  | 6.71 | 40.41 |  |  |
|  | w_exp |  |  | 3.17 | 2.54 |  |  |
|  | w_exp2 |  |  | -5.50 | -2.20 |  |  |
|  | w_eduhigh |  |  | 1.01 | 11.44 |  |  |
|  | w_male |  |  | -0.02 | -0.21 |  |  |
|  | w_capital |  |  | 0.37 | 3.44 |  |  |
|  | w_socsec |  |  | 0.52 | 6.14 |  |  |
|  | rmse |  |  | 0.74 | 26.56 |  |  |
|  | w0_const |  |  |  |  | 7.31 | 36.77 |
|  | w0_exp |  |  |  |  | 2.06 | 1.17 |
|  | w0_exp2 |  |  |  |  | -3.44 | -1.03 |
|  | w0_eduhigh |  |  |  |  | 1.18 | 6.65 |
|  | w0_male |  |  |  |  | 0.25 | 2.23 |
|  | w0_capital |  |  |  |  | 0.57 | 2.89 |
|  | rmse0 |  |  |  |  | 0.77 | 19.52 |
| $\begin{aligned} & \bar{\sigma} \\ & \tilde{H}_{0}^{0} \end{aligned}$ | w1_const |  |  |  |  | 7.82 | 45.85 |
|  | w1_exp |  |  |  |  | 4.14 | 2.69 |
|  | w1_exp2 |  |  |  |  | -7.51 | -2.30 |
|  | w1_eduhigh |  |  |  |  | 0.77 | 9.30 |
|  | w1_male |  |  |  |  | -0.17 | -2.08 |
|  | w1_capital |  |  |  |  | 0.16 | 1.52 |
|  | rmse1 |  |  |  |  | 0.65 | 23.56 |

Source: Author's calculations



Source: Author's calculations

## Opportunities

|  | Variable | VS |  | RURO |  | RURO_OC |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | coef. | t-value | coef. | t-value | coef. | t-value |
| $\overline{\text { ¢ }}$ | opp_const |  |  | -24.24 | -1.13 |  |  |
|  | opp_age |  |  | 10.98 | 0.91 |  |  |
|  | opp_age2 |  |  | -1.64 | -0.98 |  |  |
|  | opp_eduhigh |  |  | 0.53 | 0.92 |  |  |
|  | opp_formrate |  |  | 0.89 | 0.86 |  |  |
|  | opp_male |  |  | -0.61 | -1.56 |  |  |
|  | opp0_const |  |  |  |  | -41.04 | -2.48 |
|  | opp0_age |  |  |  |  | 21.57 | 2.32 |
|  | opp0_age2 |  |  |  |  | -3.21 | -2.47 |
|  | opp0_eduhigh |  |  |  |  | -0.22 | -0.71 |
|  | opp0_male |  |  |  |  | 0.69 | 2.56 |
| $\begin{aligned} & \overline{0} \\ & \text { ED } \\ & \text { 은 } \end{aligned}$ | opp1_const |  |  |  |  | -84.70 | -4.78 |
|  | opp1_age |  |  |  |  | 43.43 | 4.40 |
|  | opp1_age2 |  |  |  |  | -6.06 | -4.43 |
|  | opp1_eduhigh |  |  |  |  | 0.17 | 0.47 |
|  | opp1_form |  |  |  |  | 4.68 | 6.88 |
|  | opp1_male |  |  |  |  | 1.02 | 3.95 |

Source: Author's calculations

Hours

|  | Variable | VS |  | RURO |  | RURO OC |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | coef. | t-value | coef. | t-value | coef. | t-value |
| $\overline{\text { ¢ }}$ | hours_peak1 (40 h/w) |  |  | 2.64 | 16.65 |  |  |
|  | hours_peak2 (48 h/w) |  |  | 3.65 | 31.72 |  |  |
|  | hours_peak3 (60 h/w) |  |  | 2.01 | 9.48 |  |  |
| $\begin{aligned} & \bar{\sigma} \\ & \text { E } \\ & \text { © } \\ & \text { 드N } \end{aligned}$ | hours0_peak1 (40 h/w) |  |  |  |  | 2.16 | 7.96 |
|  | hours0_peak2 (48 h/w) |  |  |  |  | 3.15 | 16.23 |
|  | hours0_peak3 (60 h/w) |  |  |  |  | 2.02 | 6.66 |
|  | hours1_peak1 (40 h/w) |  |  |  |  | 3.33 | 17.01 |
|  | hours1_peak2 (48 h/w) |  |  |  |  | 4.60 | 31.93 |
|  | hours1_peak3 (60 h/w) |  |  |  |  | 2.48 | 8.76 |



Source: Author's calculations

## Sector Choice



## Simulation

- Simulation1: We increase the observed education of informal workers aged 18-40 years to the highest level resulting in informal workers with HE $10 \% \rightarrow 70 \%$
- Increases opportunities, wages and incomes
- Simulation2: We eliminate social insurance contributions for formal workers earning less than 3 monthly minimum wages
- Increases disposable incomes in the formal sector


Source: Author's calculations

## - Opportunities B and S1



Source: Author's calculations

## RURO-OC Sector Change for Colombia



|  | Simulation 1 |  |  |  | Simulation 2 |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Not Working | Informal | Formal |  | Not Working | Informal | Formal |
|  | Not Working | 0.994 | 0.000 | 0.006 | OLS | 1.000 | 0.000 | 0.000 |
| ¢ | Informal | 0.000 | 0.961 | 0.039 | Informal | 0.000 | 1.000 | 0.000 |
| ¢ | Formal | 0.000 | 0.016 | 0.984 | Formal | 0.000 | 0.000 | 1.000 |

Source: Author's calculations

## Conclusions

- Very limited sector movement after important exogenous changes. This result favours the hypothesis of labour market segmentation
- Unobservables determine a great deal of opportunities for informal workers in the formal sector
- Explore alternative determinants of opportunities
- Explore alternative dataset with more observations
- Calibrate a micro-founded macroeconomic model to better capture the interactions between supply and demand of formal and informal labour

