



## Weather & income: effect of household saving and well-being in South Africa

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IMPACTS WORLD 2017

## Introduction and Relevance

- Increased weather variability → source of vulnerability to stable consumption, food security and **household well-being**
- Saving and consumption responses to changes in weather in SA
- Tuberculosis (TB) and HIV are major disease epidemics in South Africa
  - SA has the highest HIV epidemic in the world: 19% prevalence among adults (UNAIDS, 2015)
  - HIV: 33% of causes of death in 2012 (WHO, 2012)
  - TB incidence rate 834 per 100,000 pop. TB: leading cause of death in 2015

## Research Question

- Saving and consumption responses to changes in weather in SA: test prediction of the **standard rational consumption model** and extensions
  - **Precautionary-saving** suggests that HH should save more if they experience higher variance in income
  - **Myopic consumption:** HH consume only in relation to current period's income - no consumption smoothing
- In turn, what are the impacts of saving on health behavior (HIV / TB testing & diagnosis)?

## Theoretical Model (1)

- Rational consumption response to income changes for a representative HH (permanent income HP, Japelli and Pistaferri, 2010)
- Standard model: HH agent max the  $E(u)$  of consumption over some time period, subject to an inter-temporal budget constraint and a terminal condition on wealth. In each period, the HH receives  $y_{it} = \bar{y}_{it} + \varepsilon_{it}$
- Predictions:
  - $c_{it}$  responds 1-to-1 to **permanent income shocks** but is nearly insensitive to **transitory shocks**  $\Delta c_{it} = \frac{r}{1+r} v_{it} + u_{it}$  ( $u_{it} = P_{it} - P_{i,t-1}$ )
  - Saving equation (Campbell, 1987):  $s_{it} = \frac{1}{1+r} v_{it} \rightarrow s_{it}$  should respond to changes in  $v_{it}$  (i.e. weather-induced ones), but not permanent income ([Japelli and Pistaferri, 2010](#)).

## Theoretical Model (2)

Saving Equation (Paxon, 1992) 
$$S_{irt} = \alpha_0 + \alpha_1 Y_{irt}^P + \alpha_2 Y_{irt}^T + \alpha_3 VAR_{ir} + \alpha_4 W_{irt} + \varepsilon_{irt}$$

- $S_{irt}$  saving for individual  $i$ , in region  $r$ , at time  $t$ .
- $Y_{irt}^P$  permanent portion of the individual's income ;  $Y_{irt}^T$  transitory portion of the HH's income
- $VAR_{ir}$  income variation of individual  $i$  in region  $r$
- $W_{irt}$  is a set of household lifecycle characteristics

### Standard model's predictions:

- $\alpha_1 \approx 0$
- $\alpha_2 \approx 1$
- $\alpha_3 \approx 0$  if a quadratic utility function is assumed - risks and income variances do not factor into the saving equation with this U(f)

If  $\alpha_3 > 0$ : indication of risk-aversion

## Data

- National Income Dynamic Study (2008, 2010, 2012, 2014)
  - nationally representative across 9 provinces and 52 districts
  - includes assets, income, expenditure, health, education, well-being...
- ERA-interim climate reanalysis from ECMWF (Dee, 2011)  
reanalysis of global atmosphere since 1979
  - daily data at 0.75x0.75 degree resolution
  - reconstructed from actual observations, spatially complete,
  - increasingly used to study areas where weather stations are scarce
  - We use 30-years of climate data-by district

# Data: variables definition

## Income, consumption and saving - unit: SAR. (Source: NIDS)

|                            |  |
|----------------------------|--|
| <b>Income</b>              | Total HH income from all sources in the previous 30 days                                   |
| <b>Durable consumption</b> | Expenditure in HH maintenance, kitchen, furniture, clothing, etc. in previous 30 days      |
| <b>Consumption</b>         | Total consumption, including or excluding durable consumption, in the previous 30 days     |
| <b>Saving</b>              | Income minus consumption, including or excluding durable consumption, for previous 30 days |

## Permanent income predictors. (Source: NIDS)

|                                   |  |
|-----------------------------------|--|
| <b>Assets (in quintiles)</b>      | Market value of owned house in quintiles (rent=0)        |
| <b>age1-age2yo, male / female</b> | No of HH male/female members from age1 to age2 years old |

## Transitory income predictors – district-specific, seasonal climatic variables. (Source: ERA-Interim)

|   |   |
|---|---|
| <b>Rainfall, deviation from mean (mm)</b>                           | Seasonal total rainfall deviation from climate normal             |
| <b>Rainfall, coefficient of variation (<math>\sigma/\mu</math>)</b> | Rainfall standard deviation divided by mean in the same season    |
| <b>Temperature, deviation from mean (mm)</b>                        | Seasonal mean deviation from climate normal                       |
| <b>Temperature, coefficient of variation</b>                        | Temperature standard deviation divided by mean in the same season |
| <b>Days in growing season over 34° C</b>                            | No days in the growing season warmer than 34° C                   |

## Wellbeing and health indicators. (Source: NIDS)

|                                 |  |
|---------------------------------|--|
| <b>Life satisfaction</b>        | Household Head's self-reported life satisfaction, on 1 (lowest) to 10 (highest) scale              |
| <b>HIV testing (household)</b>  | Indicator of whether any household had at least one individual over the age of 15 with HIV testing |
| <b>HIV testing (individual)</b> | Indicator of whether any individual over the age of 15 had HIV testing                             |

# Empirical Approach

- Paxson (1992)

- $S_{irt} = \alpha_0 + \alpha_1 Y_{irt}^P + \alpha_2 Y_{irt}^T + \alpha_3 VAR_{irt} + \alpha_4 W_{irt} + \varepsilon_{irt}$

- Decompose permanent and transitory income:

- $Y_{irt}^P = \beta_{ir}^P + \beta_1 X_{irt}^P + u_{irt}^P$

- $Y_{irt}^T = \beta_t^T + \beta_2 X_{irt}^T + u_{irt}^T$

- $X_{irt}^P$  household's assets and demographic characteristics

- $X_{irt}^T$  seasonal variations from normals, temperature and precipitation, extreme degrees days

- $VAR_{irt}$  seasonal coefficients of variation, temperature and precipitation

- $W_{irt}$  demographic categories



## Empirical Approach (1): joint significance

- Re-write saving equation:

$$S_{irt} = \gamma_t + \gamma_{ir} + \gamma_1 X_{irt}^P + \gamma_2 X_{irt}^T + \gamma_3 VAR_{irt} + v_{irt}$$

- Test joint significance of permanent and transitory income in saving:
  - $H_0: \gamma_1=0$  ,  $H_1: \gamma_1 \neq 0$
  - $H_0: \gamma_2=0$  ,  $H_1: \gamma_2 \neq 0$

**Table 4: Test of joint significance of permanent and transitory factors**

| <i>Joint significance on saving<br/>(F statistic and p-value)</i> | Durable goods as<br>consumption | Durable goods as<br>saving |
|---|---------------------------------|----------------------------|
| Permanent ( $H_0: \gamma_1 = 0$ )                                 | 1.02<br>(0.432)                 | 0.89<br>(0.546)            |
| Transitory ( $H_0: \gamma_2 = 0$ )                                | 3.74***<br>(0.000)              | 3.81***<br>(0.000)         |

Predictions of standard model confirmed:  
Saving is related to predictors of transitory income but not to predictors of permanent income

## Empirical Approach (2): propensity to save (2 steps)

- 
- $S_{irt} = \alpha_1 \widehat{Y_{irt}^P} + \alpha_2 \widehat{Y_{irt}^T} + \alpha_3 VAR_{irt} + \alpha_4 W_{irt} + \alpha_5 \widehat{u_{irt}} + w_{ir} + v_t + \varepsilon_{irt}$
- $C_{irt} = \alpha_1 \widehat{Y_{irt}^P} + \alpha_2 \widehat{Y_{irt}^T} + \alpha_3 VAR_{irt} + \alpha_4 W_{irt} + \alpha_5 \widehat{u_{irt}} + w_{ir} + v_t + \varepsilon_{irt}$
- Estimate  $\alpha_1$  and  $\alpha_2$
- Test  $\alpha_1 = \alpha_2$  in saving  $H_0: \alpha_1 = \alpha_2, H_1: \alpha_1 \neq \alpha_2$

## Result: propensity to save and consume

| <i>Coefficients and standard error</i> | Durable goods as consumption | Durable goods as saving |
|--|------------------------------|-------------------------|
| <i>Propensities to save</i>            |                              |                         |
| $\hat{y}^P$                            | 1.06***<br>(0.140)           | 1.19***<br>(0.228)      |
| $\hat{y}^T$                            | 1.83***<br>(0.313)           | 2.34***<br>(0.462)      |
| $\hat{\epsilon}$                       | 1.27***<br>(0.017)           | 1.35***<br>(0.036)      |
| <i>Propensities to consume</i>         |                              |                         |
| $\hat{y}^P$                            | 0.78***<br>(0.147)           | 0.64***<br>(0.176)      |
| $\hat{y}^T$                            | 0.34<br>(0.290)              | 0.44<br>(0.371)         |
| $\hat{\epsilon}$                       | 0.40***<br>(0.018)           | 0.39***<br>(0.023)      |
| <i>Ho: (p-values)</i>                  |                              |                         |
| $\hat{y}^P = \hat{y}^T$ in saving      | 0.019                        | 0.022                   |

Predictions of standard model confirmed:  
Consumption co-varies with permanent income only

## Empirical Application (well being and health behaviour):

1. Well-being = self-reported life satisfaction of household head

$$W_{irt}^* = \alpha_0 + \beta_1 SAV^P + \beta_2 SAV^T + u_i + v_t + \varepsilon_{irt}$$

- Fixed effects ordered logit (Baetschmann, 2015)

2. HIV test = whether the household / individual has taken an HIV test

- data available for 2010, 2012 and 2014 at individual level
- hazard (incidence) rate at household and individual level
- households and year fixed effect

## Empirical Model: well being and health behaviour

Table 9: Life satisfaction and HIV testing regression on saving behavior

|   | All     | Agriculture | Non-agriculture |
|---|---------|-------------|-----------------|
| <i>Life satisfaction (odds ratio)</i>         |         |             |                 |
| $SAV^P$                                       | 1.27    | 1.15        | 1.29            |
| $SAV^T$                                       | 1.14*** | 1.14**      | 1.14***         |
| <i>HIV testing (household hazard ratio)</i>   |         |             |                 |
| $SAV^P$                                       | 1.05*** | 1.05***     | 1.05***         |
| $SAV^T$                                       | 1.00    | 1.00        | 1.00            |
| <i>HIV testing (individuals hazard ratio)</i> |         |             |                 |
| $SAV^P$                                       | 1.06*** | 1.06***     | 1.06***         |
| $SAV^T$                                       | 0.97    | 0.99        | 0.97            |

- Increase in log-saving from  $Y^T$  increases the odds of a 1-unit increase in life-satisfaction by 14%
- 1-step increase in log-saving from  $Y^P$ : 5-6% increase in the incidence hazard ration of HIV testing

## Main Findings

- standard model: propensity to save from transitory income close to 1 while that of permanent income close to 0
  - saving from both transitory and permanent income are significant, but
  - the proportion saved from transitory income > permanent income
- evidences of precautionary saving driven by non-agriculture HH
- strong evidences of myopic consumption for agriculture HH
- increase in log-saving from transitory income increases the odds of an increase in self-reported life-satisfaction
- increase in log-saving from **permanent income** leads to an increase in the hazard ration of having taken an HIV test

## Conclusions and Policy Implications

- HH adjust for consumption of non-durable items (e.g. food) in order to cope with income changes
  
- Programs to encourage HIV testing - may need stronger inducement than a transitory injection of income. Focus on fundamental improvements to change behavior in the long term?

**Reverse causality issue!** Health shocks impact on household's saving behavior, after controlling for demographic factors (permanent income), and weather-related factors (transitory income)

Thank you very much  
for your attention

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# Agriculture vs non agriculture

Table 7: Test of joint significance and estimation of coefficients

| <i>Joint significance on saving (F statistics and p-value)</i> |                               | Durable goods as consumption | Durable goods as saving |
|--|-------------------------------|------------------------------|-------------------------|
| Agriculture HH   | Permanent ( $\gamma_1 = 0$ )  | 1.28<br>(0.215)              | 1.30<br>(0.202)         |
|  | Transitory ( $\gamma_2 = 0$ ) | 1.62<br>(0.074)              | 1.65<br>(0.066)         |
| Non-agriculture HH   | Permanent ( $\gamma_1 = 0$ )  | 1.32<br>(0.186)              | 0.94<br>(0.515)         |
|  | Transitory ( $\gamma_2 = 0$ ) | 2.32**<br>(0.004)            | 2.31**<br>(0.005)       |
| <i>Propensities to save (coefficients and standard error)</i>  |                               |                              |                         |
| Agriculture HH   | $\hat{y}^P$                   | 0.52<br>(0.319)              | 1.25*<br>(0.517)        |
|  | $\hat{y}^T$                   | 1.38*<br>(0.627)             | 2.24*<br>(0.995)        |
|  | $\hat{\varepsilon}$           | 1.29***<br>(0.030)           | 1.32***<br>(0.065)      |
| Non-agriculture HH   | $\hat{y}^P$                   | 1.18***<br>(0.157)           | 1.19***<br>(0.254)      |
|  | $\hat{y}^T$                   | 1.85***<br>(0.370)           | 2.13***<br>(0.535)      |
|  | $\hat{\varepsilon}$           | 1.26***<br>(0.020)           | 1.36***<br>(0.042)      |

# Agriculture vs non agriculture

Table 8: Test for model extensions by type of households

| <i>F statistics and p-value</i> |   | Durable goods as consumption | Durable goods as saving |
|---------------------------------|---|------------------------------|-------------------------|
| Agriculture<br>HH               | <i>Precautionary saving</i><br>( $H_0: \alpha_3 = 0$ in saving) | 0.63<br>(0.817)              | 1.12<br>(0.338)         |
|                                 | <i>Myopic consumption</i><br>(Chow interaction test)            | 0.68<br>(0.606)              | 0.91<br>(0.457)         |
| Non-agriculture<br>HH           | <i>Precautionary saving</i><br>( $H_0: \alpha_3 = 0$ in saving) | 4.06***<br>(0.000)           | 4.07***<br>(0.000)      |
|                                 | <i>Myopic consumption</i><br>(Chow interaction test)            | 3.70**<br>(0.005)            | 1.98<br>(0.095)         |