# Measuring and Explaining International Differences in Hours Worked 

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- This paper: answer using new data set
- Harmonize 85 countries of all income levels
- Draw on nationally representative household surveys
- Challenge: surveys not already standardized
- Large efforts to maximize international comparability


## Relevant for Welfare

- Standard utility function: $U(c, 1-h)$
- Consumption per capita, $c$, widely studied
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- Example: welfare of average Africans \& North Americans
- c roughly $\sim 5 \%$ as high for Africans (e.g. Penn World Tables)
- If $h$ lower too, welfare differences may be smaller


## Main Empirical Findings

- Average hours worked per adult are higher in poor countries
- True for both sexes, all age groups
- Magnitudes substantial: 29 hours/week in poorest countries, compared to 19 hours per week in richest


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- Average hours worked per adult are higher in poor countries
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- Magnitudes substantial: 29 hours/week in poorest countries, compared to 19 hours per week in richest
- Low vs middle income countries: accounted for by employment rates

Middle vs high income countries: accounted for by hours per worker

Theory of our Findings

- Ingredients
- Subsistence consumption requirements in preferences
- Individuals vary in marginal disutility of work
- Countries differ only in productivity


## Theory of our Findings

- Ingredients
- Subsistence consumption requirements in preferences
- Individuals vary in marginal disutility of work
- Countries differ only in productivity
- Mechanism:
- When productivity low, marginal utility of $c$ very high

Those with low time endowment work, but few hours

- As productivity rises, those with high disutility of work drop out hours of those working fall

Measuring Hours Worked

## Constructing Our Data Set

- Use surveys from 2005 or closest available year
- Use only nationally representative surveys of households World Bank's Living Standards Measurement Studies (15), the European Union Labor Force Surveys (26), IPUMS (6), other individual surveys (36)
- Challenge: surveys not standardized; required large efforts to harmonize
- Full data set: 85 countries; focus on 43 "core countries" with most comparable data


## Core Countries

We define core countries as those that meet the following criteria
(1) Survey covers whole calendar year, 5,000+ individuals

2 Actual hours worked (not usual) at all jobs (not just primary job)
(3) In the last week, or recent reference week

4 Producing output counted in NIPA (not e.g. home child care)

## Empirical Findings

## Average Weekly Hours per Adult



## Average Hours per Prime (Aged 25-55)



## Average Hours per Old (Aged 55+)



| Permutation Tests of Differences in Means |  |  |  |
| :--- | :---: | :---: | :---: |
| Age Group | Differences in Mean Hours |  |  |
|  | Low - Middle | Middle - High | Low - High |
| All | $6.7^{* * *}$ | $3.0^{* * *}$ | $9.7^{* * *}$ |
| Young | $7.5^{* * *}$ | $1.6^{*}$ | $9.1^{* * *}$ |
| Prime | $6.2^{* * *}$ | 1.1 | $7.3^{* * *}$ |
| Old | $6.8^{* * *}$ | $5.1^{* * *}$ | $11.9^{* * *}$ |
| $* * *$ | means a P-value less than $0.01,{ }^{* *}$ less than $0.05,^{*}$ less than 0.10. |  |  |

Accounting for Differences in Hours Per Adult

- Higher employment rates in poor countries?
- Greater hours worked per worker in poor countries?
- We'll look first in the aggregate, then separately by males and females


## Employment Rates



## Employment Rates, Prime-Aged



## Employment Rates, Old



## Employment Rates by Age

| Age Group | Differences in Mean Employment Rates |  |  |
| :--- | :---: | :---: | :---: |
|  | Low - Middle | Middle - High | Low - High |
| All | $0.20^{* * *}$ | -0.02 | $0.18^{* * *}$ |
| Young | $0.23^{* * *}$ | -0.04 | $0.18^{* * *}$ |
| Prime | $0.17^{* * *}$ | -0.10 | $0.07^{* * *}$ |
| Old | $0.27^{* * *}$ | $0.10^{* *}$ | $0.37^{* * *}$ |

Average Weekly Hours Per Worker


Hours Per Worker by Age

| Age Group | Differences in Mean Hours |  |  |
| :--- | :---: | :---: | :---: |
|  | Low - Middle | Middle - High | Low - High |
| All | -1.7 | $6.5^{* * *}$ | $4.8^{* * *}$ |
| Young | -2.8 | $8.0^{* * *}$ | $5.2^{* * *}$ |
| Prime | -0.6 | $6.6^{* * *}$ | $6.0^{* * *}$ |
| Old | -4.5 | $4.8^{* * *}$ | 0.3 |

Model

## Quantitative Theory

- Subsistence consumption requirements in preferences
- Countries differ only in productivity
$\Rightarrow$ Naturally predicts decreasing hours per adult
$\Rightarrow$ Challenge: different patterns for the extensive \& intensive margin


## Model Environment

- Each country has measure one of individuals
- Each member endowed with one unit of time, but the marginal disutility of working varies across individuals
- Heterogeneity represented by $\eta \in[0,1]$
- Denote the PDF of $\eta$ by $f(\eta)$ and the CDF by $F(\eta)$
- "Grandpa" decides hours of market work $h(\eta)$ for all individuals, assigns the same consumption $c$ to all individuals.


## Household Problem

- Household's problem

$$
\max _{c,\{h(\eta)\}_{\eta=0}^{1}} \log (c-\bar{c})-\alpha \int_{0}^{1} \frac{\epsilon}{1+\epsilon}(\eta+h(\eta))^{\frac{1+\epsilon}{\epsilon}} f(\eta) d \eta
$$

such that $c=A \int_{0}^{1} h(\eta) f(\eta) d \eta$.

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- Who should work at all?
- Cutoff, $\bar{\eta}$, s.t. those with $\eta_{i}<\bar{\eta}$ work


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- Who should work at all?
- Cutoff, $\bar{\eta}$, s.t. those with $\eta_{i}<\bar{\eta}$ work
- Conditional on working, how many hours should each work?


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- Result: all those working must have same leisure, $\ell=1-(\eta+h(\eta))$


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- Why? First-order condition for $h(\eta) \Rightarrow$

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\frac{1}{c-\bar{c}} \cdot A=\alpha(\eta+h(\eta))^{1 / \epsilon}
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- Thus $\eta+h(\eta)$ same for all $\eta$ s.t. $h(\eta) \geq 0$


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- Thus $\eta+h(\eta)$ same for all $\eta$ s.t. $h(\eta) \geq 0$
$\Rightarrow$ Household's problem is reduced to choosing cutoff, $\bar{\eta}$, and leisure, $\ell$, for those working


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- Why? If cutoff chosen optimally, then worker at cutoff must work zero hours
- Thus, given optimal cutoff $\bar{\eta}, \ell$ equals $1-(\bar{\eta}+0)$
$\Rightarrow$ Household's problem reduces to one equation in $\bar{\eta}$


## Equilibrium Properties

- Equilibrium $\bar{\eta}$ satisfies

$$
\{\bar{\eta}-E(\eta \mid \eta<\bar{\eta})\} F(\bar{\eta})=\left[\alpha \bar{\eta}^{1 / \epsilon}\right]^{-1}+\frac{\bar{c}}{A}
$$

- Hours per adult: $H(\bar{\eta})=\{\bar{\eta}-E(\eta \mid \eta<\bar{\eta})\} F(\eta)$
- Employment rate: $E(\bar{\eta})=F(\bar{\eta})$
- Hours per worker: $\tilde{H}(\bar{\eta})=\frac{H}{E}=\bar{\eta}-E(\eta \mid \eta<\bar{\eta})$


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- Employment rate: $E(\bar{\eta})=F(\bar{\eta})$
- Hours per worker: $\tilde{H}(\bar{\eta})=\frac{H}{E}=\bar{\eta}-E(\eta \mid \eta<\bar{\eta})$
- Equilibrium $\bar{\eta}$ is decreasing in $A$
- As $A \rightarrow \infty$, or when $\bar{c}=0, \bar{\eta}$ independent of $A$


## Quantitative Analysis

## Extended Model for Quantitative Analysis

- Each country has 4 demographic groups
- Exogenous labor supply
k: Children (ages 0-14, both sexes) - do not work at all
$y$ : Young (ages 15-24, both sexes) - work predetermined hours
- Endogenous labor supply (extensive and intensive margin)
p: Prime men (ages 25-54)
o: Women (ages 25+) and Older Men (ages 55+)
- $\psi_{i}(A) \forall i \in\{k, y, p, o\}$ : share of each group with $\sum_{i} \psi_{i}(A)=1$


## Population Shares $\psi$

Population Shares by GDP


$$
\begin{aligned}
\max _{c,\left\{h_{\rho}(\eta)\right\}_{\eta=0}^{1}\left\{h_{o}(\eta)\right\}_{\eta=0}^{1}} \log (c-\bar{c})-\alpha \sum_{i=p, o} \psi_{i}(A) \int_{0}^{1} \frac{1}{1+\frac{1}{\epsilon}}\left(\eta+h_{i}(\eta)\right)^{1+\frac{1}{\epsilon}} f_{i}(\eta) d \eta \\
\text { s.t. } c=A\left[\psi_{y}(A) \hat{H}_{y}+\sum_{i=p, o} \psi_{i}(A) \int_{0}^{1} h_{i}(\eta) f_{i}(\eta) d \eta\right]
\end{aligned}
$$

## Extended Model for Quantitative Analysis

- Parameterize model to match moments for low-income group
- Model's predictions across world income distribution for varying $A$
- Focus on two groups: prime males and "others" (prime women+old)
- "Others" have lower employment rates and hours per worker
- Employment decreases much faster for the "others"


## Parameterization

- Normalize $A=1$ in high-income countries
$\hookrightarrow A=0.03$ in low-income countries
- Let one unit of time represent 112 hours per week
- Fix Frisch elasticity $\epsilon=1$
- micro estimates: " $\leq 1$ "
- macro estimates: " $\geq 1$ "


## Distribution of $\eta$

- Prime male draw from $F_{1}(\eta)$
- "Others" draw from $F_{1}(\eta)$ with prob. $\phi$, from $F_{2}(\eta)$ with $1-\phi$
- $f_{i}(\eta)$ and $F_{i}(\eta) \forall i=1,2$ set as beta distributions


## Moments to Match (Low-Income Group)

(1) Subsistence consumption is $50 \%$ percent of total consumption

- consistent with estimates of Rozenzweig \& Wolpin (1993), Atkeson \& Ogaki (1996) and food expenditure shares.


## Prime:

(2) Employment rate
(3) Hours per worker
(4) Std deviation of hours per worker

## Others:

(5) Employment rate
(6) Hours per worker
(7) Std deviation of hours per worker

## Distribution of $\eta$

Prime Males


Others


Average Hours per Adult


- Success: Hours per adult decrease in GDP pc
- Failure: Hours per adult are too convex


## Employment Rates by Type

Prime Males


Others


- Success: Employment rate declines much more for the "others"
- Failure: Employment rate declines
- too much for prime males
- too little for the others


## Average Hours per Worker by Type

Prime Males


Others


- Success: Hours per worker for the "others" decrease much less than the employment rate
- Failure: Hours per worker are convex


## Relevance for Welfare Differences Across Countries

- Welfare measured based on Jones \& Klenow (2011)
- Option 1: Work average $h_{H}$ \& get fraction $\lambda$ of average $c_{H}$ in high-income countries ( $H$ )
- Option 2: Work average $h_{j}$ and get average $c_{j}$ in country $j$
- Welfare of $j$ is $\lambda$ that satisfies

$$
U\left(\lambda \cdot c_{H}, h_{H}\right)=U\left(c_{j}, h_{j}\right)
$$

where

$$
U(c, h)=\log (c-\bar{c})-\alpha \frac{\epsilon}{1+\epsilon}(\eta+h)^{\frac{1+\epsilon}{\epsilon}}
$$

## Welfare as Percent of High-Income Group

Country Income Group

|  | Low | Middle | High | High/Low |
| :--- | :--- | ---: | :---: | :---: |
| Consumption | 6.4 | 27.9 | 100 | 15.6 |
| + Non-homothetic Prefs | 5.6 | 27.3 | 100 | 17.9 |
| + Hours Worked | 2.8 | 23.4 | 100 | 36.0 |

Average Hours per Week on Home Production

|  | Country Income Group |  |  |
| :--- | :---: | :---: | :---: |
|  | Low | Middle | High |
| Cooking | 8.9 | 8.1 | 6.1 |
|  | $(5)$ | $(6)$ | $(9)$ |
|  | 6.0 | 7.1 | 5.7 |
| Childcare | $(5)$ | $(6)$ | $(9)$ |
|  | 6.0 | 6.4 | 2.6 |
| Shopping | $(7)$ | $(6)$ | $(9)$ |
|  | 2.0 | 2.2 | 3.7 |
| Collecting Water | (5) | $(6)$ | $(9)$ |
|  | 3.5 | 2.0 | 0.0 |
|  | $(8)$ | $(2)$ | $(0)$ |
| Total Hours | $\mathbf{2 6 . 4}$ | $\mathbf{2 5 . 8}$ | $\mathbf{1 8 . 1}$ |

## Conclusions

- On average, adults work about $50 \%$ more hours in poorest countries than in richest
- Accounted for mostly by employment rates
- Consistent with simple model of subsistence consumption needs + heterogeneity in disutility of work
- Welfare differences across countries larger than previously thought


## Extra Slides

## An Aggregate Model: Setup

- Standard Neo-Classical Growth Model with log-log preferences:

$$
u=(c+G-\bar{c})+\alpha \ln (1-h)
$$

(1) Marginal rate of substitution $\mathrm{b} / \mathrm{w}$ leisure \& cons. $=$ the price ratio

$$
\frac{\alpha /(1-h)}{1 /(c+G-\bar{c})}=(1-\tau) w
$$

(2) Profit-maximization: wage $=$ marginal product of labor

$$
w=(1-\theta) k^{\theta} h^{-\theta}=(1-\theta) y / h
$$

$\Rightarrow$ Combining both yields:

$$
h=\frac{(1-\theta)}{(1-\theta)+\left(\frac{c}{y}+\frac{G}{y}-\frac{\bar{c}}{y}\right) \frac{\alpha}{1-\tau}}
$$

## An Aggregate Model: Calibration

$$
h=\frac{(1-\theta)}{(1-\theta)+\left(\frac{c}{y}+\frac{G}{y}-\frac{\bar{c}}{y}\right) \frac{\alpha}{1-\tau}}
$$

- Set $\theta=0.3224$ \& normalize time endowment to 100 hours per week
- $\frac{c}{y}$ (private cons.) and $\frac{G}{y}$ (government cons.) from PWT
- $\bar{c}$ : average over $0.5 \cdot c$ in core countries in the lowest income tercile
- $\tau$ : tax to GDP ratio from IFS
- Take mean of $\frac{c}{y}, \frac{G}{y}, \frac{\bar{c}}{y}, \tau$ for countries in the highest income tercile, set $\alpha$ to match mean of hours per person in the highest inc. tercile
- Given $\alpha$ solve model for each country with country-specific inputs

An Aggregate Model: Predictions


## An Aggregate Model: Predictions

|  | Mean Hours | $\frac{\bar{h} \text { low inc. }}{h}$ high inc. | $\frac{\bar{h} \text { middle inc. }}{\bar{h} \text { high inc. }}$ | $R^{2}$ |
| :--- | :---: | :---: | :---: | :---: |
| Data | 21.9 | 1.52 | 1.18 | - |
| Model |  |  |  |  |
| All inputs country-specific | 22.6 | 1.56 | 1.18 | 0.39 |
| Only $\frac{c}{y}$ country-specific | 19.3 | 0.98 | 0.98 | 0.03 |
| Only $\frac{G}{y}$ country-specific | 19.2 | 0.96 | 1.02 | 0.01 |
| Only $\frac{\bar{c}}{y}$ country-specific | 22.2 | 1.66 | 1.07 | 0.22 |
| Only $\tau$ country-specific | 20.1 | 1.13 | 1.10 | 0.27 |

## Average Hours per Adult Men



## Average Hours per Woman



## Average Hours per Young (Aged <25)



## Average Weekly Hours Per Adult: Broader Sets of Countries

| Set of Countries | Country Income Group |  |  |  |
| :--- | :---: | :---: | :---: | :---: |
|  | Low | Middle | High | N |
| Core Countries | 28.9 | 22.2 | 19.2 | 43 |
| + Partial-Year Surveys | 26.1 | 22.5 | 19.6 | 76 |
| + All Hours Measures | 26.1 | 22.9 | 20.0 | 83 |

Average Weekly Hours per Adult: US Population Weights


## Average Weekly Hours per Adult: US Time-Series



- US Time-Series • 2005 World Cross-Section

US Time-Series 2005 World Cross-Section

| Mean Middle Inc. | 1.17 | 1.16 |
| :---: | :---: | :---: |
| Mean High Inc. |  |  |

## Employment Rates, Young



## Employment Rates, Prime-Aged



## Employment Rates, Old



## Employment Rates by Age

| Age Group | pp. Differences in Mean Employment Rates |  |  |
| :--- | :---: | :---: | :---: |
|  | Low - Middle | Middle - High | Low - High |
| All | $20^{* * *}$ | -2 | $18^{* * *}$ |
| Young | $23^{* * *}$ | -4 | $18^{* * *}$ |
| Prime | $17^{* * *}$ | -10 | $7^{* * *}$ |
| Old | $27^{* * *}$ | $10^{* *}$ | $37^{* * *}$ |

## Hours Worked per Worker, Young



Hours Per Worker by Age

| Age Group | Differences in Mean Hours |  |  |
| :--- | :---: | :---: | :---: |
|  | Low - Middle | Middle - High | Low - High |
| All | -1.7 | $6.5^{* * *}$ | $4.8^{* * *}$ |
| Young | -2.8 | $8.0^{* * *}$ | $5.2^{* * *}$ |
| Prime | -0.6 | $6.6^{* * *}$ | $6.0^{* * *}$ |
| Old | -4.5 | $4.8^{* * *}$ | 0.3 |

## Implications for Development Accounting

|  | Mean High Inc. | Mean High Inc. |
| :--- | :---: | :---: |
| Mean Low Inc. | Mean Medium Inc. |  |

- Largest productivity differences for hourly measure
- Per capita \& per hour do not differ that drastically because hours per capita more similar across countries than hours per adult
- $11 \%$ higher in low income countries
- 5\% higher in middle income countries


## Employment Rate

## Prime Males



Other


## Hours per Workers



Other


## Moments to Match (Low-Income Group)

(1) Subsistence consumption is $50 \%$ percent of total consumption

- consistent with estimates of Rozenzweig \& Wolpin (1993),

Atkeson \& Ogaki (1996) and food expenditure shares.
Prime:
(2) Employment rate: $93 \%$
(3) Hours per worker: 44.4
(4) Std deviation of hours per worker: 24.0

## Others:

(5) Employment rate: $57 \%$
(6) Hours per worker: 36.6
(7) Std deviation of hours per worker: 24.5
(1) $\bar{c}=0.003$
(2) $\alpha=11$
(3) $k_{p}=1.9$
(4) $\theta_{p}=1.9$
(5) $\phi=0.61$
(6) $k_{o}=14.5$
(7) $\theta_{o}=2$

