

# Never Too Old to Save - Explaining the High Saving Rates of the Chinese Elderly

Yi Chen

Xi'an Jiaotong University, Jinhe Center for Economic Research

July, 2016

# Motivation

- A well known fact about China is its saving rate is among the highest in the world (World Bank, 2010).

# Motivation

- A well known fact about China is its saving rate is among the highest in the world (World Bank, 2010).
- National saving is composed of household saving, government saving and corporate saving.

# Motivation

- A well known fact about China is its saving rate is among the highest in the world (World Bank, 2010).
- National saving is composed of household saving, government saving and corporate saving.
  - Household saving is on average the most important component in the past twenty years.

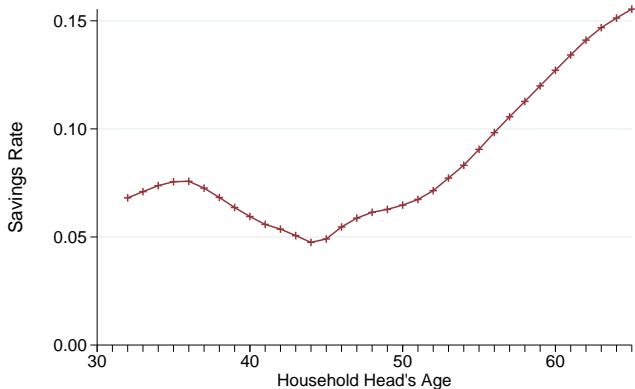
# Motivation

- A well known fact about China is its saving rate is among the highest in the world (World Bank, 2010).
- National saving is composed of household saving, government saving and corporate saving.
  - Household saving is on average the most important component in the past twenty years.
    - Savings from the elderly account for an important share of household saving.

# Motivation

- A well known fact about China is its saving rate is among the highest in the world (World Bank, 2010).
- National saving is composed of household saving, government saving and corporate saving.
  - Household saving is on average the most important component in the past twenty years.
    - Savings from the elderly account for an important share of household saving.
    - The saving rates of the elderly are found to be higher than the middle-aged (Chamon and Prasad, 2010; Yang et al., 2011).

Figure 1: Age Pattern of Chinese Saving Rate in 2002



Source: Chinese Household Income Project, 2002.

# Main Contribution

The main contribution of this paper is to answer the following questions -



# Main Contribution

The main contribution of this paper is to answer the following questions -

- Empirically - Why do the elderly in China save so much (in absolute&relative terms)?

# Main Contribution

The main contribution of this paper is to answer the following questions -

- Empirically - Why do the elderly in China save so much (in absolute&relative terms)?
- Theoretically - Can the counter intuitive fact be consistent with the life-cycle model? How to apply LCM in the set-up of a fast developing economy?

# Previous Work Explaining the High Chinese Saving Rate

- Educational and medical expenses - Chamon and Prasad (2010)
- Flattened income profile - Song and Yang (2010)
- Pension reform - Feng et al. (2011)
- Coresidence - Rosenzweig and Zhang (2014)
- Migration and habit formation - Brugiavini et al. (2013)
- One-child policy - Wei and Zhang (2010); Banerjee et al. (2010)

Previous research is more successful in explaining why young people keep high saving. However, they cannot explain the high saving of the elderly.

# Preview of Results

- High and increasing pension income in China is the major contributor of the high saving rates of the Chinese elderly.

# Preview of Results

- High and increasing pension income in China is the major contributor of the high saving rates of the Chinese elderly.
- When life cycle profile of pension income is taken into account, and together with medical expenditures and bequest motives, I can replicate the high and increasing saving rates after retirement.

# Preview of Results

- High and increasing pension income in China is the major contributor of the high saving rates of the Chinese elderly.
- When life cycle profile of pension income is taken into account, and together with medical expenditures and bequest motives, I can replicate the high and increasing saving rates after retirement.
- The counter-intuitive empirical facts in China can be well-explained under the framework of life-cycle model.

## Contradiction to Previous Studies?

Previous research also emphasizes the role of pension (for example, Feng et al. (2011))

## Contradiction to Previous Studies?

Previous research also emphasizes the role of pension (for example, Feng et al. (2011))

- Previous story: pension reform during the 1990's reduce the replacement rate → precautionary motive boosts the saving of the elderly



## Contradiction to Previous Studies?

Previous research also emphasizes the role of pension (for example, Feng et al. (2011))

- Previous story: pension reform during the 1990's reduce the replacement rate → precautionary motive boosts the saving of the elderly
- My story: maybe the opposite is what is really happening -

## Contradiction to Previous Studies?

Previous research also emphasizes the role of pension (for example, Feng et al. (2011))

- Previous story: pension reform during the 1990's reduce the replacement rate → precautionary motive boosts the saving of the elderly
- My story: maybe the opposite is what is really happening -
  - The pension reform reduce the *de jure* replacement rate, but not *de facto*

## Contradiction to Previous Studies?

Previous research also emphasizes the role of pension (for example, Feng et al. (2011))

- Previous story: pension reform during the 1990's reduce the replacement rate → precautionary motive boosts the saving of the elderly
- My story: maybe the opposite is what is really happening -
  - The pension reform reduce the *de jure* replacement rate, but not *de facto*
  - From a life cycle point of view, lower pension would increase saving BEFORE retirement and reduce saving AFTER retirement.

# How is this Presentation Organized?

# How is this Presentation Organized?

- (Reduced form) Empirical evidence about the role of

# How is this Presentation Organized?

- (Reduced form) Empirical evidence about the role of
  - \* Pension
  - Medical expenses
  - Bequest motive

# How is this Presentation Organized?

- (Reduced form) Empirical evidence about the role of
  - \* Pension
  - Medical expenses
  - Bequest motive
- (Structural model) A dynamic life-cycle model

# How is this Presentation Organized?

- (Reduced form) Empirical evidence about the role of
  - \* Pension
  - Medical expenses
  - Bequest motive
- (Structural model) A dynamic life-cycle model
  - Set-up
  - Identification & estimation
  - Simulation



# Outline

- 1 Introduction
- 2 Empirical Evidence**
- 3 Why Doesn't Consumption Increase More
- 4 Model
- 5 Simulation Results
- 6 Conclusion

# Background

- The female labor force participation rate is among highest in the world.
- Retirement age: male - 60, female officer - 55, female worker - 50
- Exceptions include early retirement because of work injuries or disability and late retirement as requested by employers because of special skills (professors and experienced doctors, for example). In both cases, individual decisions are not important.
- Pension payment starts right at the time of retirement.
- Amount of pension is indexed to the average of current workers' wage.

# Data

Urban sample of following data sets,

- China Household Income Project (1995, 2002)
  - Advantage: information for each family member, detailed employment information, asset information. People are asked to recall their past income for the past 5 years, providing partial “panel” natural.
- China Health and Nutrition Survey (1997, 2000, 2004, and 2006)
- China Health and Retirement Longitudinal Study (2011)

# Sample

- **Sample:** nuclear family (exclude couples living with their children), both husband and wife are in labor force or retired, exclude negative income/expenditure, exclude top and bottom 1% of income/expenditure.

# Empirical Evidence

I will present three pieces of empirical evidence about the causal effect of pension on saving:

# Empirical Evidence

I will present three pieces of empirical evidence about the causal effect of pension on saving:

- Time series variation

# Empirical Evidence

I will present three pieces of empirical evidence about the causal effect of pension on saving:

- Time series variation
- Cross sectional variation

# Empirical Evidence

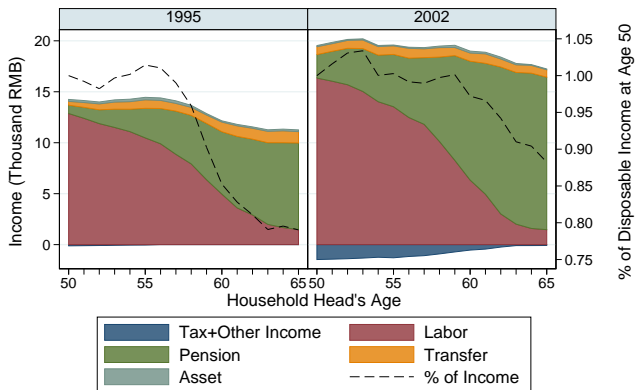
I will present three pieces of empirical evidence about the causal effect of pension on saving:

- Time series variation
- Cross sectional variation
- Pension reform as exogenous shock



# Across Time

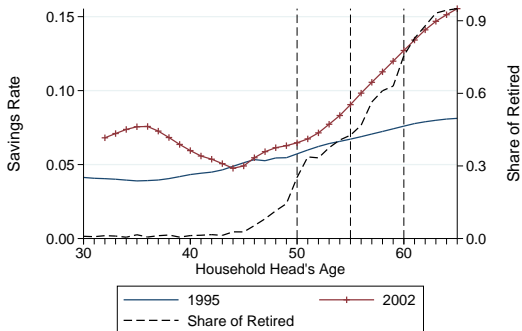
Figure 2: Composition of Disposable Income by Survey Years



Source: Chinese Household Income Project, 1995, 2002.

# Across Time

Figure 3: Age Pattern of Chinese Saving Rate by Survey Years

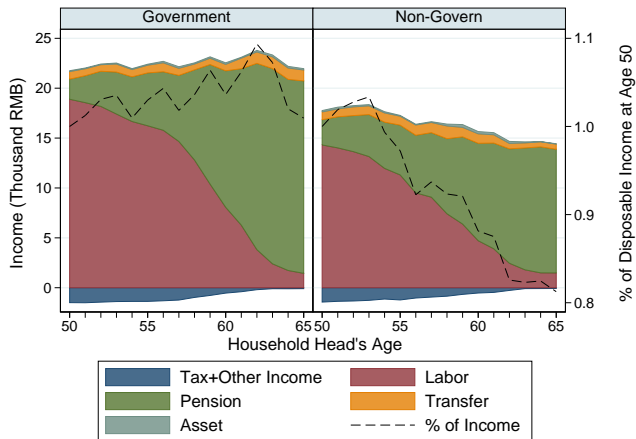


Source: Chinese Household Income Project, 1995, 2002.

▸ robustness

# Across Group

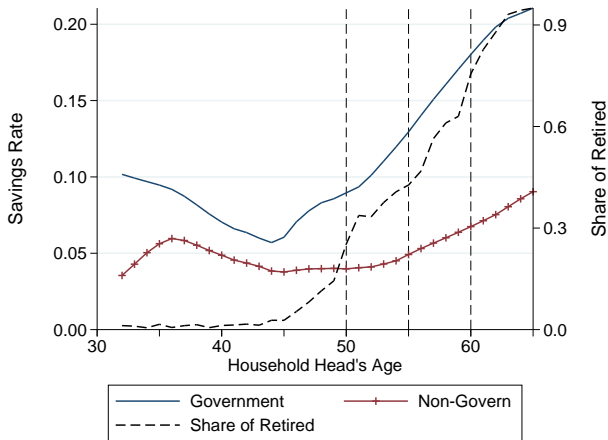
Figure 4: Composition of Disposable Income by Employment Types



Source: Chinese Household Income Project, 2002.

# Across Group

Figure 5: Age Pattern of Chinese Saving Rate by Employer Types



Source: Chinese Household Income Project, 2002.

These patterns show:

- During the periods when pensions are higher, the saving rate for the elderly is also higher
- For the group whose pensions are more generous, the saving rate for the elderly is also higher

These patterns show:

- During the periods when pensions are higher, the saving rate for the elderly is also higher
- For the group whose pensions are more generous, the saving rate for the elderly is also higher

However, there are possible endogeneity problems.

These patterns show:

- During the periods when pensions are higher, the saving rate for the elderly is also higher
- For the group whose pensions are more generous, the saving rate for the elderly is also higher

However, there are possible endogeneity problems.

- A temporary positive economic shock in 2002 will both increase pension income and saving rate.

These patterns show:

- During the periods when pensions are higher, the saving rate for the elderly is also higher
- For the group whose pensions are more generous, the saving rate for the elderly is also higher

However, there are possible endogeneity problems.

- A temporary positive economic shock in 2002 will both increase pension income and saving rate.
- People who are more risk averse are more likely to choose firms with higher pensions to secure elderly life.



These patterns show:

- During the periods when pensions are higher, the saving rate for the elderly is also higher
- For the group whose pensions are more generous, the saving rate for the elderly is also higher

However, there are possible endogeneity problems.

- A temporary positive economic shock in 2002 will both increase pension income and saving rate.
- People who are more risk averse are more likely to choose firms with higher pensions to secure elderly life.

To address the possible concerns of endogeneity, I use the pension reform since 1990's as exogenous shock.

# *De Jure* Replacement, *De Facto* Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate

# *De Jure* Replacement, *De Facto* Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate
  - This statement is true for the *de jure* rate, but not for the *de facto* rate

# *De Jure* Replacement, *De Facto* Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate
  - This statement is true for the *de jure* rate, but not for the *de facto* rate
- Why does the Chinese government initiate the reform?

# *De Jure* Replacement, *De Facto* Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate
  - This statement is true for the *de jure* rate, but not for the *de facto* rate
- Why does the Chinese government initiate the reform?
  - Before 1978 - Planned economy, government provide cradle-to-grave social security through state-owned-enterprise.

# *De Jure* Replacement, *De Facto* Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate
  - This statement is true for the *de jure* rate, but not for the *de facto* rate
- Why does the Chinese government initiate the reform?
  - Before 1978 - Planned economy, government provide cradle-to-grave social security through state-owned-enterprise.
  - 1978 - early 1990s - Firms are assumed responsibility of their retirees.

# De Jure Replacement, De Facto Replacement and Pension Reform

- It is widely believed the pension reform in the 1990's reduced the replacement rate
  - This statement is true for the *de jure* rate, but not for the *de facto* rate
- Why does the Chinese government initiate the reform?
  - Before 1978 - Planned economy, government provide cradle-to-grave social security through state-owned-enterprise.
  - 1978 - early 1990s - Firms are assumed responsibility of their retirees.
    - The *de facto* rate is much lower than the *de jure* rate because unprofitable firms delay or cancel the pension payment to their retirees.
    - Meng (2003) estimated that in 1995 and 1996, around 50% of the SOEs reported losses.
- A new three-tier pension scheme is established - public + occupational + voluntary

# Pension Reform as Exogenous Variable

- Since the start of 1990, the Chinese pension system gradually switched from a PAYG system to a three-tier system.
- Before 1995, some provinces started their own experiment first and have different target replacement rates.
- In 1997, a formal national level reform occurred, resulting in the same target replacement rate across the country.
- As a result, provinces with lower replacement rates before the reform benefited more from the reform.



Province	Target Replacement Before Reform
Beijing	75
Shanxi	95
Jiangsu	65
Henan	75
Hubei	85
Guangdong	70
Chongqing	95
Sichuan	95
Yunnan	71

# Where Does the Exogenous Variation Comes From?

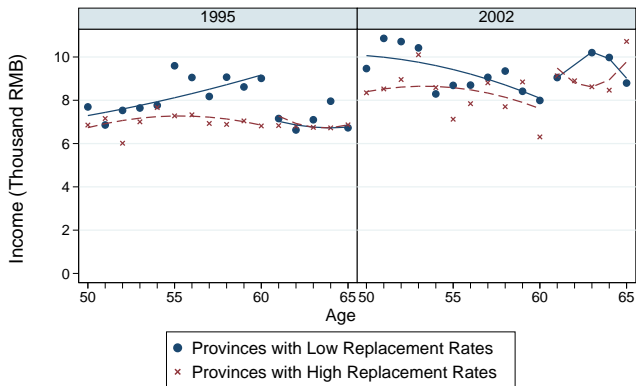
Province	Before Reform		After Reform	
	Jiangsu (Rate=0.65)	Hubei (Rate=0.85)	Jiangsu (Rate=0.75)	Hubei (Rate=0.75)
Working	6,300	5,700	7,700	7,500
Retired	4,095	4,845	5,775	5,625
DID	-1,350		-50	
DDD	1,300			

## Identification Strategy - DDD

$$\begin{aligned} \log(\text{Income}_{i,p,t}) = & \beta_1 \text{After}_t + \beta_2 \text{Retire}_{i,p,t} + \beta_3 \Delta \text{Rate\_Rp}_p \times \text{Retire}_{i,p,t} \\ & + \beta_4 \Delta \text{Rate\_Rp}_p \times \text{After}_t + \beta_5 \text{Retire}_{i,p,t} \times \text{After}_t \\ & + \beta_6 \Delta \text{Rate\_Rp}_p \times \text{Retire}_{i,p,t} \times \text{After}_t + \beta_7 X_{i,t} \\ & + \sum \beta_{8,p} \text{Prov}_p + \sum \beta_{9,p} \text{Prov}_p \times \text{After}_t + \beta_0 + \varepsilon_{i,p,t} \end{aligned}$$

- 1st difference - retire - exogeneity of the reform comes from replacement rate, and the difference before and after retirement captures the retirement rate.
- 2nd difference - after - before the reform the target replacement rates are the different and after reform they become the same.
- 3rd difference -  $\Delta \text{Rate\_Rp}$  - replacement rates go up more for provinces with lower initial rates.

Figure 6: Replacement Rates and Pension Reform



Source: Chinese Household Income Project, 1995, 2002.

Table 3: Estimation of the Effect of Pension on Saving Rate

Dependent Variables	log(Income)	log(Expenditure)	Saving Rate
	(1)	(2)	(3)
$\Delta$ Replacement Rate	-0.417***	-0.167	-0.605**
*Retired	(0.147)	(0.153)	(0.276)
$\Delta$ Replacement Rate	0.247*	0.234*	0.00774
*After	(0.139)	(0.139)	(0.232)
Retired*After	0.416***	0.113	0.615**
	(0.150)	(0.148)	(0.274)
$\Delta$ Replacement Rate	0.383**	0.0760	0.685**
*Retired*After	(0.186)	(0.194)	(0.347)
Observations	11,380	11,499	11,380

▶ placebo

# Sum Up

- The reform works in the desired direction as expected. Retirees in provinces experiencing greater increase in replacement rates enjoy greater increase in pensions.

# Sum Up

- The reform works in the desired direction as expected. Retirees in provinces experiencing greater increase in replacement rates enjoy greater increase in pensions.
- However, retirees experiencing greater increase in pensions do not increase their expenditures accordingly. Instead, the extra pensions mostly transit into saving.

# Sum Up

- The reform works in the desired direction as expected. Retirees in provinces experiencing greater increase in replacement rates enjoy greater increase in pensions.
- However, retirees experiencing greater increase in pensions do not increase their expenditures accordingly. Instead, the extra pensions mostly transit into saving.
- Why?



# Outline

- 1 Introduction
- 2 Empirical Evidence
- 3 Why Doesn't Consumption Increase More**
- 4 Model
- 5 Simulation Results
- 6 Conclusion

## Some Possibilities

- Concerns for high future medical expenditures.
- Bequest motive.

## Other Possibilities

Of course, there maybe other possibilities including

- Prepare for the cost of children's education, housing and marriage.
- Deteriating health status.
- Longer life expectancy.

However, I provide evidence these explanation fails to match some important empirical facts in China. [▶ Why?](#)

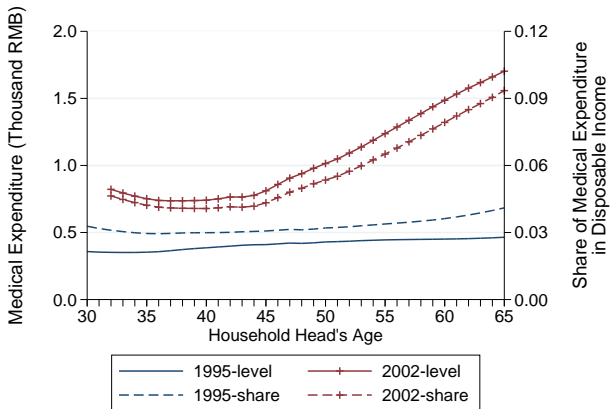
# The Role of Medical Expenditures

- Medical expenditures are believed to be an important variable to explain the saving of the elderly. (for example, DeNardi et al. (2010) argues this is the main reason why the old people in the United States keep a high amount saving.)

# The Role of Medical Expenditures

- Medical expenditures are believed to be an important variable to explain the saving of the elderly. (for example, DeNardi et al. (2010) argues this is the main reason why the old people in the United States keep a high amount saving.)
- In 2002, medical expenditures are significantly higher, especially for the old people. This happens as a result of a decline public medical insurance during the period.

Figure 7: Out of Pocket Medical Expenditure by Years



Source: Chinese Household Income Project, 1995, 2002.

▶ Why?

## Possible Effects of Medical Expenditures

However, it is unclear how will medical expenditures affect household saving because it will have two effects

## Possible Effects of Medical Expenditures

However, it is unclear how will medical expenditures affect household saving because it will have two effects

- Mechanical effect - saving is defined as income minus expenditures, therefore medical expenditures are subtracted from saving.



## Possible Effects of Medical Expenditures

However, it is unclear how will medical expenditures affect household saving because it will have two effects

- Mechanical effect - saving is defined as income minus expenditures, therefore medical expenditures are subtracted from saving.
- Precautionary effect - high current medical expenditures are usually accompanied with even higher future medical expenditures. Household may save more to prepare for the future needs.

# Bequest Motives

- Identifying bequest motives is difficult.
- Even if a positive amount of assets are observed when the elderly pass away, we cannot guarantee whether they are intentional bequests or accidental bequests.

## Suggestive Evidence 1: Direct Objective Questions

Table 5: Distribution of the Objective Question "*I want to leave as large a bequest as possible to my children*"

	Urban Households	
	Observations	Percentage
I think so	81	17.69%
I tend to think so	205	44.76%
I can't say one way or the other	127	27.73%
I tend not to think so	38	8.3%
I do not think so	7	1.53%
Total	458	100%

Source: Yin (2010)

## Suggestive Evidence 2: Saving for Old-Age Support?

Table 6: Who can Rely on for Old-Age Support

Sample	Below 50	50~60	Above 60
Children	36.07%	31.71%	28.68%
Saving	8.00%	3.36%	2.65%
Pension or retirement salary	50.15%	59.34%	63.51%
Commercial pension insurance	1.82%	0.93%	0.31%
Other	3.95%	4.65%	4.86%
Observations	987	1,397	1,625

Note: Source, CHARLS 2011.

## Suggestive Evidence 3: Saving Rate and Number of Children

- Another identification strategy is through number of children.

## Suggestive Evidence 3: Saving Rate and Number of Children

- Another identification strategy is through number of children.
- A natural assumption is if the household does not have children, then the saving is more likely to be accidental.

## Suggestive Evidence 3: Saving Rate and Number of Children

- Another identification strategy is through number of children.
- A natural assumption is if the household does not have children, then the saving is more likely to be accidental.
- From CHARLS 2011, for old households (older than 60) without any child, conditional on education and income level, they save 11.1% less when compared to households with at least one child.

# Outline

- 1 Introduction
- 2 Empirical Evidence
- 3 Why Doesn't Consumption Increase More
- 4 Model**
- 5 Simulation Results
- 6 Conclusion



# Why I Need a Model

- To quantify the importance of pension income when joint with bequest motives and medical expenditures.
- To carry out counterfactual simulations.

# Outline of the Model

- Preference
- Heterogeneity of household
- Income process
- Medical expenditure process
- Constraints

# Preference

A household  $i$  in a specific cohort in his age  $t$  has a CRRA utility function

$$u^i(C_t^i) = \delta(h_t^i, l_t^i) \frac{(C_t^i)^{1-\nu}}{1-\nu}$$

where  $\delta(h_t^i, l_t^i) = 1 + \delta_1 h_t^i + \delta_2 l_t^i + \delta_3 h_t^i l_t^i$ . Here  $C_t^i$  is consumption,  $h_t^i$  is health status and  $l_t^i$  is leisure.

# Preference

A household  $i$  in a specific cohort in his age  $t$  has a CRRA utility function

$$u^i(C_t^i) = \delta(h_t^i, l_t^i) \frac{(C_t^i)^{1-\nu}}{1-\nu}$$

where  $\delta(h_t^i, l_t^i) = 1 + \delta_1 h_t^i + \delta_2 l_t^i + \delta_3 h_t^i l_t^i$ . Here  $C_t^i$  is consumption,  $h_t^i$  is health status and  $l_t^i$  is leisure.

The reason to include health and leisure into the model is that previous research has found they are important determinants of consumption after retirement.

- At the end of each year, there is a mortality shock. Household dies with probability  $m_t$ . There is a utility from bequests.

$$b^i(A_t^i) = (\theta_0 + \theta_1 Child^i) \frac{(A_t^i + \kappa)^{1-\nu}}{1-\nu}$$

where  $Child^i$  is an indicator variable whether the household has child or not.

- At the end of each year, there is a mortality shock. Household dies with probability  $m_t$ . There is a utility from bequests.

$$b^i(A_t^i) = (\theta_0 + \theta_1 Child^i) \frac{(A_t^i + \kappa)^{1-\nu}}{1-\nu}$$

where  $Child^i$  is an indicator variable whether the household has child or not.

- The reason to include child is empirical evidence shows strength of bequest is closely related to whether the household has child or not.

# Household Heterogeneity

- Education - fixed through out life cycle.
- Health - transition probability estimated using CHNS.
- Cohort - multiple cohorts in the model.

Heterogeneity affects household through income, medical expenditure, utility function and initial conditions.

# Income Process

- There is income uncertainty, and for a given cohort, income is assumed to be

$$\ln(Y_t^i) = \ln(\bar{Y}_t^i) + e_t^i$$

Here  $\bar{Y}_t^i = f(t, E^i, h_t^i)$

That is, the average cohort income will be estimated as a function of age, education and health (also their interaction term). Income profile for different cohort will be estimated separately.



- There is a transitory part and permanent part,  $\varepsilon_t$  and  $e_t$ , which are normally distributed white noise

$$\begin{aligned}e_t^i &= u_t^i + \varepsilon_t^i \\u_t^i &= \rho u_{t-1}^i + \varepsilon_t^i\end{aligned}$$

- Income process is estimated outside the model. Because people are asked about income in previous years, it is possible to identify transitory income and permanent income using Meghir and Pistaferri (2004)'s approach.
- Parameter estimate

$$\hat{\sigma}_\varepsilon = 0.045, \hat{\sigma}_e = 0.0039, \rho = 0.87$$

# Modeling Life-Cycle Income Profile

- It is important to take into account the fact the in China is income is growing quickly for all cohorts.

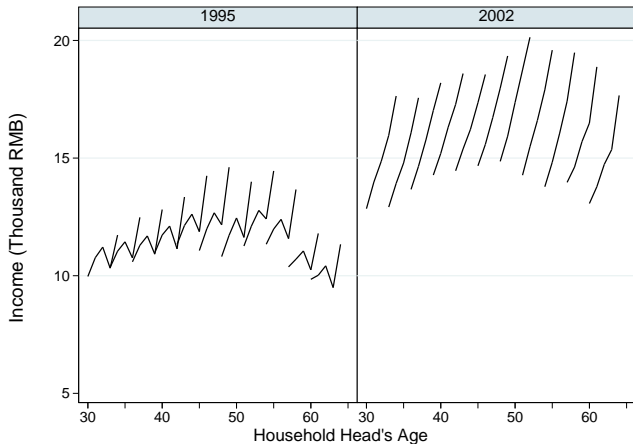
# Modeling Life-Cycle Income Profile

- It is important to take into account the fact the in China is income is growing quickly for all cohorts.
- In the model I estimate the life cycle profiles separately for each cohort. Therefore I make a clear distinction between “life cycle profile” and “cross-sectional profile.”

- In developed countries, the economy is stationary. “Cross-sectional profile” serves as a good proxy for “life cycle profile.”

- In developed countries, the economy is stationary. “Cross-sectional profile” serves as a good proxy for “life cycle profile.”
- In China, the pension income is indexed to current worker’s average wage. The economy is growing fast. Household’s income keeps increasing even after retirement, creating a sharp difference between “cross-sectional profile” and “life cycle profile.”

Figure 8: Life Cycle Profile of Income



Source: Chinese Household Income Project, 1995, 2002.

► Expectation?

# Medical Expenditure Process

- Medical expenditure process is also estimated outside the model.
- Medical expenditures are determined by two elements - health status (estimated using CHNS) and medical expenditure conditional on health status (estimated using CHIP).

- Medical expenditures depend on whether a "shock" happens. The probability of the shock  $\pi(h_t^i, E^i)$  depends on the current health status and education.



- Medical expenditures depend on whether a "shock" happens. The probability of the shock  $\pi(h_t^i, E^i)$  depends on the current health status and education.
- Allow the possibility of catastrophic shock - conditional on a "shock" happening, there is a probability of  $\phi$  for this shock to be catastrophic
  - $M_t^{i,1}$  if no shock happens (with probability  $1 - \pi$ )
  - $M_t^{i,2}$  if small shock happens (with probability  $\pi(1 - \phi)$ )
  - $M_t^{i,3}$  if catastrophic shock happens (with probability  $\pi\phi$ )
  - for simplicity I assume  $M_t^{i,3} = \gamma M_t^{i,2}$ .

# Constraints

- Budget constraint

$$A_{t+1}^i = (1 + r)A_t^i + Y_t^i + T_t^i - C_t^i - M_t^i$$

$T_t^i$  is the cash transfer from the government to guarantee consumption floor  $\underline{C}$  (estimated by the average consumption of bottom 1%).

# Constraints

- Budget constraint

$$A_{t+1}^i = (1 + r)A_t^i + Y_t^i + T_t^i - C_t^i - M_t^i$$

$T_t^i$  is the cash transfer from the government to guarantee consumption floor  $\underline{C}$  (estimated by the average consumption of bottom 1%).

- Liquidity constraint (only 1.5% of households in China has negative assets)

$$A_t^i \geq 0, \forall t$$

# Timing of Dynamic Life Cycle Model

- Representative household with initial assets, initial health status, initial type (education level, employment type). May live up to a certain amount of periods.

# Timing of Dynamic Life Cycle Model

- Representative household with initial assets, initial health status, initial type (education level, employment type). May live up to a certain amount of periods.
- At the beginning of each period, random income shock and medical shock are realized. Together with household's types, these shocks determine the level of income and medical expenditures.

# Timing of Dynamic Life Cycle Model

- Representative household with initial assets, initial health status, initial type (education level, employment type). May live up to a certain amount of periods.
- At the beginning of each period, random income shock and medical shock are realized. Together with household's types, these shocks determine the level of income and medical expenditures.
- Household makes consumption and saving decision. Government guarantee a minimum consumption level.

# Timing of Dynamic Life Cycle Model

- Representative household with initial assets, initial health status, initial type (education level, employment type). May live up to a certain amount of periods.
- At the beginning of each period, random income shock and medical shock are realized. Together with household's types, these shocks determine the level of income and medical expenditures.
- Household makes consumption and saving decision. Government guarantee a minimum consumption level.
- At the end of a period, a mortality shock and health transition shock is realized.

# Optimization Problem

The recursive problem is given by,

$$V_t(A_t, h_t, l_t, u_t; E) = \max_{C_t} \{u(C_t) + \beta E_t V_{t+1}(A_{t+1}, h_{t+1}, l_{t+1}, u_{t+1}; E)\}$$

subject to

$$\begin{aligned} A_{t+1} &= (1+r)A_t + Y_t + T_t - C_t - M_t \\ T_t &= \max\{\underline{C} + M_t - Y_t - (1+r)A_t, 0\} \\ A_t &\geq 0 \end{aligned}$$



# Estimation of Parameters

The parameters in the model can be estimated from three sources,

- Fix discount factor  $\beta = 0.98$  and obtain interest rate  $r$  from macro data
- Estimated outside the model (income process, medical expenditure process)
- Estimated within the model (risk aversion, bequest motives, utility shifters)

# What is new about the model?

- Allow for income uncertainty along with medical expenses uncertainty.
- Emphasize the difference between “life-cycle profile” and “cross-sectional” profile.
- Model is built to overcome data limitation (e.g., lack of panel data about medical expenses).
- “Partially” identifies bequest motives from “residual claimer.”

# Parameters to Be Identified Within the Model

- Strength of bequest motive -  $\theta_0, \theta_1$
- Curvature of bequest motive -  $\kappa$
- Relative risk aversion -  $\nu$
- Preference shifter -  $\delta_1, \delta_2, \delta_3$

# Match of Moments

- The model is estimated using Method of Simulated Moments (MSM).

# Match of Moments

- The model is estimated using Method of Simulated Moments (MSM).
- Moments to be matched: saving by cohort, education, health and year. Additionally, I add a moment of the difference in saving rates between families with children and without children.

# Match of Moments

- The model is estimated using Method of Simulated Moments (MSM).
- Moments to be matched: saving by cohort, education, health and year. Additionally, I add a moment of the difference in saving rates between families with children and without children.
- Moments are chosen to identify all the parameters. ▶ Identification

## Estimate of Parameters in the Model

Parameters	Estimate (Standard Error)
$\theta_0$	97.24 (14.7648)
$\theta_1$	126.8 (19.4594)
$\kappa$	18.91 (3.1710)
$\nu$	1.989 (0.1934)
$\delta_1$	-1.332 (1.5503)
$\delta_2$	0.0996 (0.0864)
$\delta_3$	0.1948 (0.1450)

# Parameter Estimation

- Relative risk aversion  $\nu$  is estimated to be around 2, which is actually lower compared to the estimates in U.S.



# Parameter Estimation

- Relative risk aversion  $\nu$  is estimated to be around 2, which is actually lower compared to the estimates in U.S.
  - There is no evidence suggesting the Chinese elderly are more risk averse.

# Parameter Estimation

- Relative risk aversion  $\nu$  is estimated to be around 2, which is actually lower compared to the estimates in U.S.
  - There is no evidence suggesting the Chinese elderly are more risk averse.
- The strength of the bequest motive for households without child is only 43% of those with children.

# Parameter Estimation

- Relative risk aversion  $\nu$  is estimated to be around 2, which is actually lower compared to the estimates in U.S.
  - There is no evidence suggesting the Chinese elderly are more risk averse.
- The strength of the bequest motive for households without child is only 43% of those with children.
  - Suggesting strong bequest motives.

# Outline

- 1 Introduction
- 2 Empirical Evidence
- 3 Why Doesn't Consumption Increase More
- 4 Model
- 5 Simulation Results**
- 6 Conclusion

# Questions to Be Answered

- Does the model match empirical patterns well?

# Questions to Be Answered

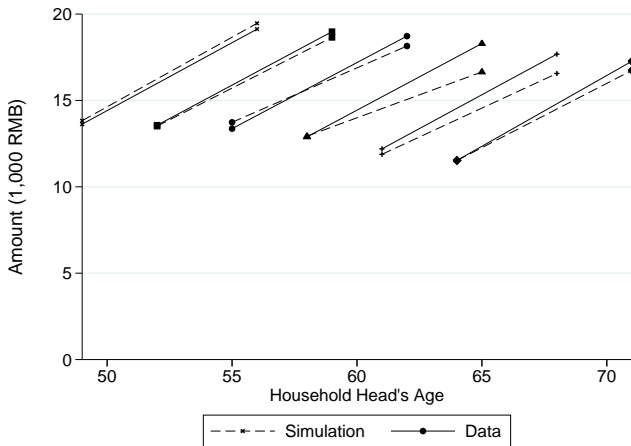
- Does the model match empirical patterns well?
- Can pension explain the high saving rate for the Chinese elderly?

# Questions to Be Answered

- Does the model match empirical patterns well?
- Can pension explain the high saving rate for the Chinese elderly?
- How important is Chinese economy growth upon the elderly saving?

# Match of Income

Figure 9: Match of Income

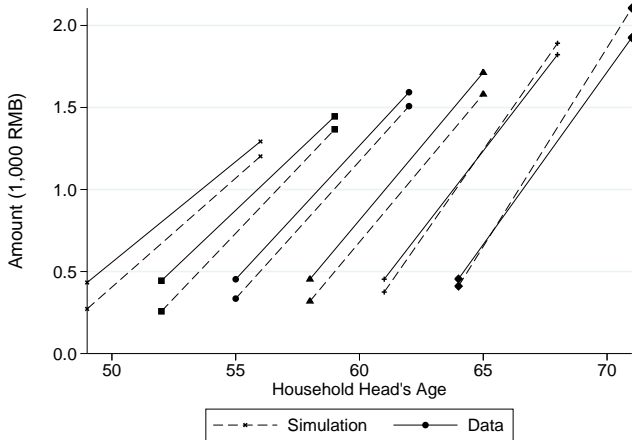


Source: Chinese Household Income Project, 1995, 2002.



# Match of Medical Expenditure

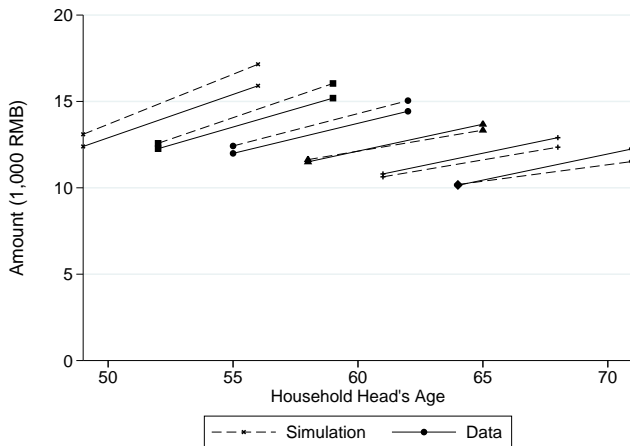
Figure 10: Match of Medical Expenditure



Source: Chinese Household Income Project, 1995, 2002.

# Match of Consumption

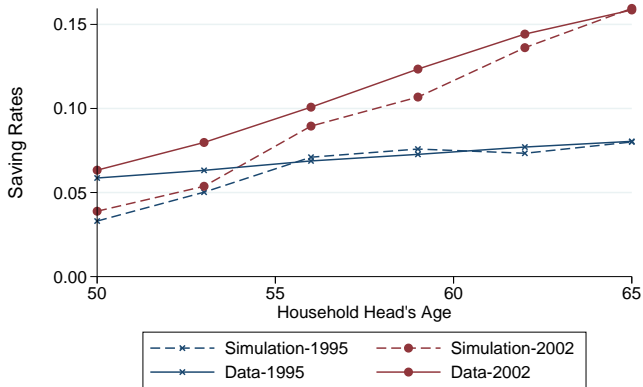
Figure 11: Match of Consumption



Source: Chinese Household Income Project, 1995, 2002.

# Match of Saving Rate Across Time

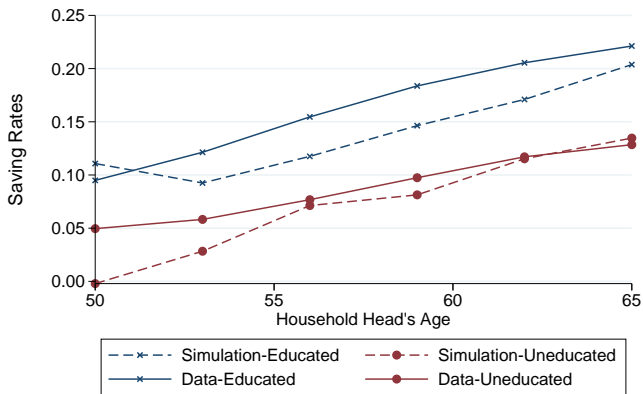
Figure 12: Match of Saving Rates for Different Waves



Source: Chinese Household Income Project, 1995, 2002.

# Match of Saving Rate Across Education

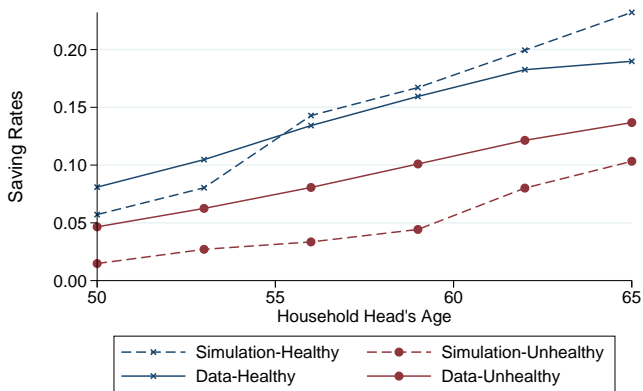
Figure 13: Match of Saving Rates for Different Education Level



Source: Chinese Household Income Project, 1995, 2002.

# Match of Saving Rate Across Health

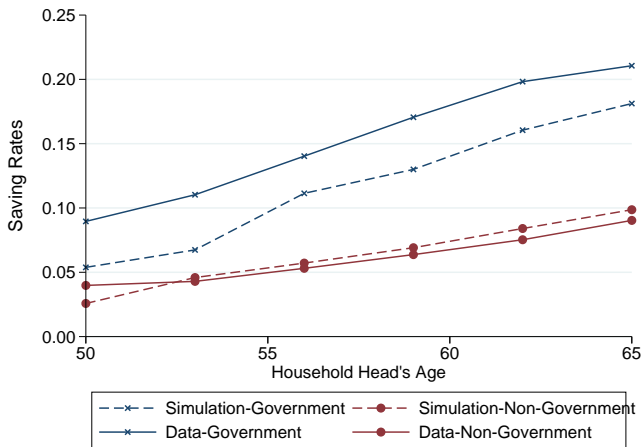
Figure 14: Match of Saving Rates for Different Health Status



Source: Chinese Household Income Project, 1995, 2002.

# Out of Sample Test - Across Employment Type

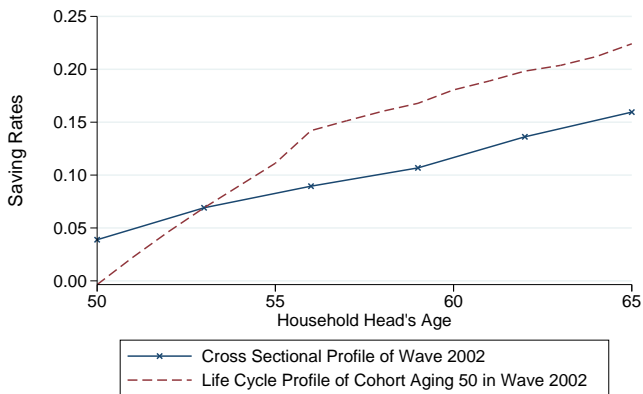
Figure 15: Match of Saving Rates for Different Employment Types



Source: Chinese Household Income Project, 1995, 2002.

# Life Cycle versus Cross Sectional

Figure 16: Comparing Life Cycle Profile and Cross Sectional Profile



Source: Chinese Household Income Project, 1995, 2002.

# Sum Up

- The model successful explain the variation of saving rate over age 50 across
  - Time (81.8%)
  - Education (61.8%)
  - Health (36.9%)
  - Employment type (55.9%)
- It is life cycle effect instead of cohort effect driving the results.



# Simulation 1 - Can pension explain the high saving rates for the Chinese elderly?

To test the important of pension,

- Replace the life cycle pension profile with alternative cross-sectional profile.
- Pension index to CPI instead of wage.

# Simulation 1 - Can pension explain the high saving rates for the Chinese elderly?

To test the important of pension,

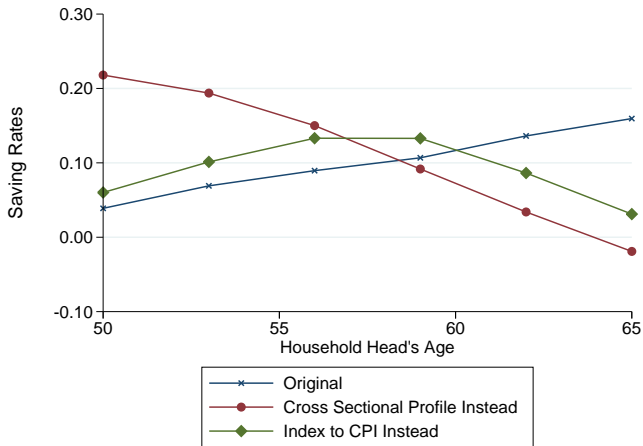
- Replace the life cycle pension profile with alternative cross-sectional profile.
- Pension index to CPI instead of wage.

To test how pension works jointly with bequest motive and medical expenditure

- Bequest motive -  $\theta_0 = 0$ ,  $\theta_1 = 0$
- Medical expenditure -  $M_t = 0$

# Importance of Pension Income

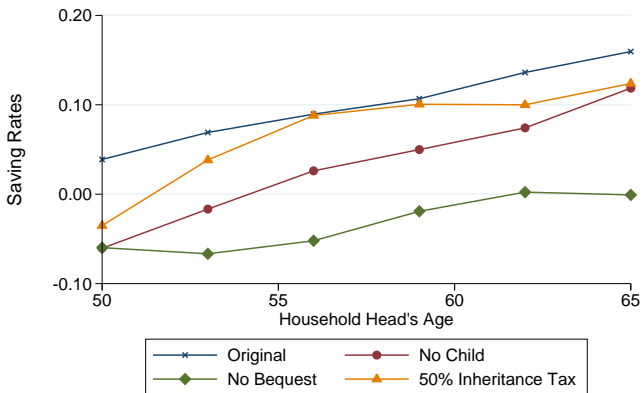
Figure 17: Experiment 1 - Effect of Pension



Source: Chinese Household Income Project, 1995, 2002.

# Importance of Bequest Motive

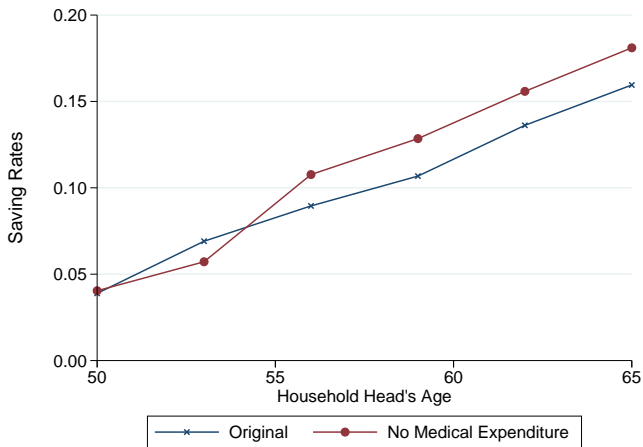
Figure 18: Experiment 2 - Effect of Bequest Motives



Source: Chinese Household Income Project, 1995, 2002.

# Importance of Medical Expenditure

Figure 19: Experiment 3 - Effect of Medical Expenditures



Source: Chinese Household Income Project, 1995, 2002.

## Policy Implication

- Medical expenditure has little effect on elderly's saving
  - Policy on medical insurance will not change saving behavior a lot.

# Policy Implication

- Medical expenditure has little effect on elderly's saving
  - Policy on medical insurance will not change saving behavior a lot.
- Pension income and bequest motive are the main determinants
  - Policy on pension scheme will affect saving rate.
  - Policy on bequest (inheritance tax for example) will affect saving rate.

# Policy Implication

- Medical expenditure has little effect on elderly's saving
  - Policy on medical insurance will not change saving behavior a lot.
- Pension income and bequest motive are the main determinants
  - Policy on pension scheme will affect saving rate.
  - Policy on bequest (inheritance tax for example) will affect saving rate.
- The counter-intuitive fact that the elderly save more than the middle-aged is mostly because of institutional reason
  - In China pension is indexed to wage
  - In China there is no inheritance tax



## Simulation 2 - Growth Rate and Saving Rate

Economic growth affects elderly saving directly through increase in pension income.

## Simulation 2 - Growth Rate and Saving Rate

Economic growth affects elderly saving directly through increase in pension income.

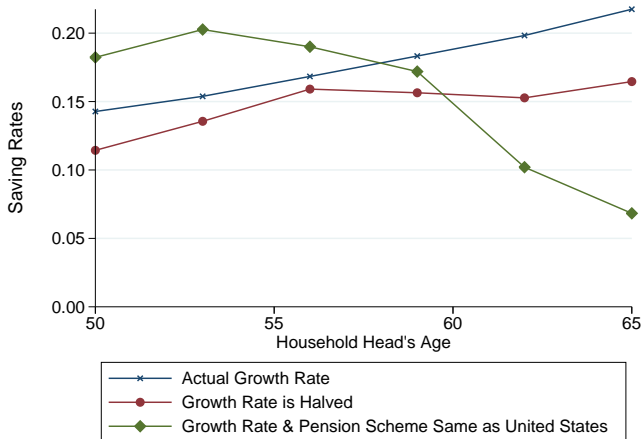
- If the Chinese economy starts to slow down, how will the saving rate looks like? Will it still be U-shaped?

## Simulation 2 - Growth Rate and Saving Rate

Economic growth affects elderly saving directly through increase in pension income.

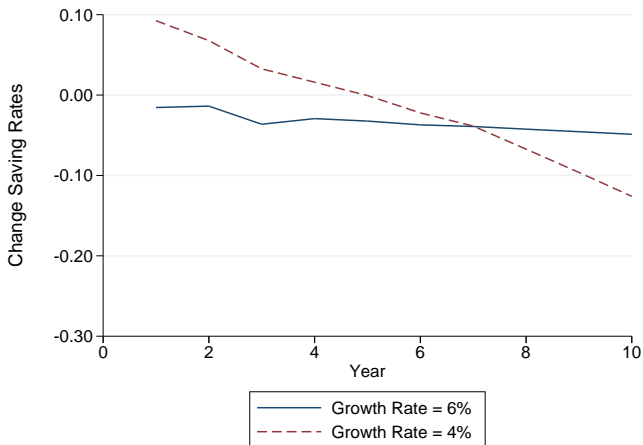
- If the Chinese economy starts to slow down, how will the saving rate looks like? Will it still be U-shaped?
- Will people respond differently?

Figure 20: Simulation of Cross Sectional Saving Rate with Different Growth Rate



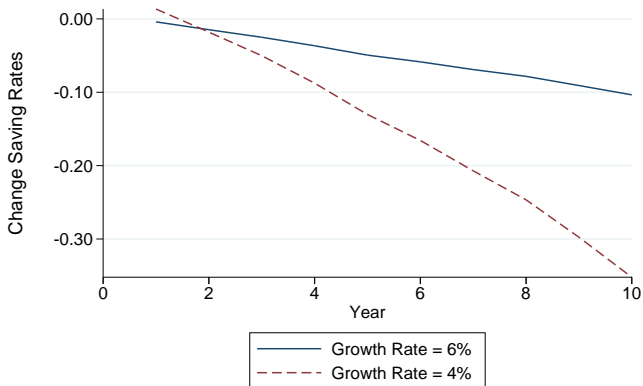
Source: Chinese Household Income Project, 1995, 2002.

Figure 21: Response of a Slowdown in Economic Growth (Age = 50)



Source: Chinese Household Income Project, 1995, 2002.

Figure 22: Response of a Slowdown in Economic Growth (Age = 60)



Source: Chinese Household Income Project, 1995, 2002.

## Policy Implication

- If the growth rate is not that high, elderly people will save lower than middle aged, which is observed in developed countries like United States.

## Policy Implication

- If the growth rate is not that high, elderly people will save lower than middle aged, which is observed in developed countries like United States.
- In case of economic slow down, the old people will react to a greater extent than to the middle aged.



# Outline

- 1 Introduction
- 2 Empirical Evidence
- 3 Why Doesn't Consumption Increase More
- 4 Model
- 5 Simulation Results
- 6 Conclusion**

# Conclusion

- Pension plays an important role in understanding the high saving rates for the Chinese elderly.

# Conclusion

- Pension plays an important role in understanding the high saving rates for the Chinese elderly.
- Using pension reform as a natural experiment, I observe that when there is an increase in pension, there is no corresponding increase in consumption, resulting in higher saving.

# Conclusion

- Pension plays an important role in understanding the high saving rates for the Chinese elderly.
- Using pension reform as a natural experiment, I observe that when there is an increase in pension, there is no corresponding increase in consumption, resulting in higher saving.
- Model shows the increasing pension after retirement together with bequest motive is the key determinant of high saving for the Chinese elderly.

# Conclusion

- Pension plays an important role in understanding the high saving rates for the Chinese elderly.
- Using pension reform as a natural experiment, I observe that when there is an increase in pension, there is no corresponding increase in consumption, resulting in higher saving.
- Model shows the increasing pension after retirement together with bequest motive is the key determinant of high saving for the Chinese elderly.
- The pattern of saving rates in China is highly related to its economic growth. If there is a slowdown, the saving rate will drop quickly.

# Thank You!

# Robustness of the Empirical Fact

- Cohort effect?

# Robustness of the Empirical Fact

- Cohort effect?
  - Track the saving rates of different cohorts



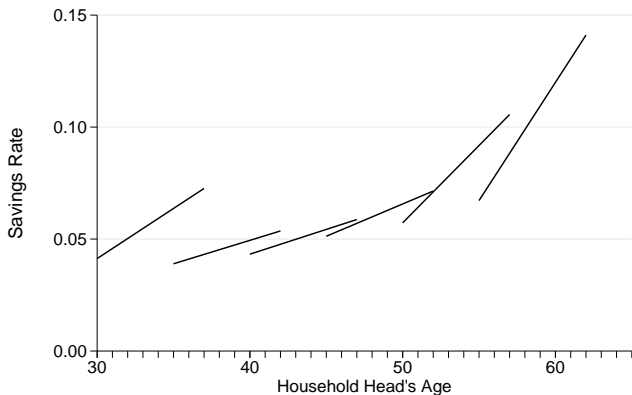
# Robustness of the Empirical Fact

- Cohort effect?
  - Track the saving rates of different cohorts
- Selection?

# Robustness of the Empirical Fact

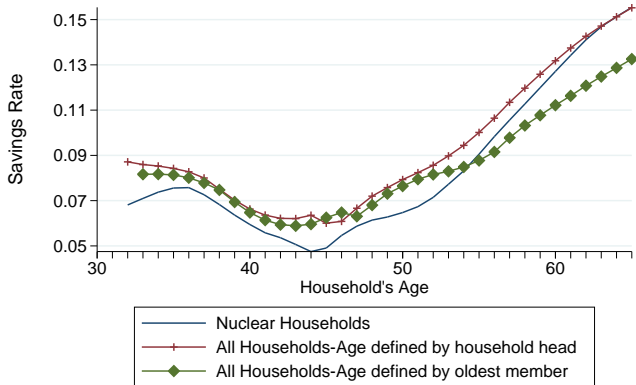
- Cohort effect?
  - Track the saving rates of different cohorts
- Selection?
  - Plot the age profile of saving rates not restricted to nuclear household

Figure 23: Age Pattern of Chinese Saving Rate by Cohorts



Source: Chinese Household Income Project, 1995, 2002.

Figure 24: Robustness of Age Profile of Saving Rate against Selection



Source: Chinese Household Income Project, 2002.

[← back](#)

# Test Validity of the Reform

$$Income_{i,p,t} = \beta_1 After_t + \beta_2 Retire_{i,p,t} + \beta_3 Rate\_Before_p \times Retire_{i,p,t} + \beta_4 X_{i,t} + \sum \beta_{5,p} Prov_p + \varepsilon_{i,p,t}$$

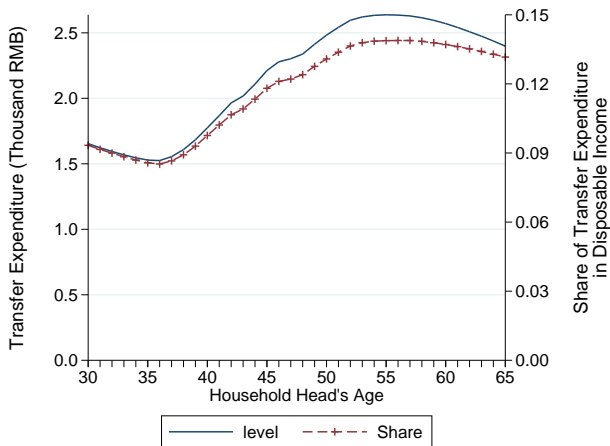
- If the reform is valid, I expect,
  - $\beta_3 > 0$  before the reform
  - $\beta_3 = 0$  after the reform (placebo test)
- If the replacement rate is associated with some unobserved factors that may also affect income directly,  $\beta_3$  should not be greater than zero even after the reform.

Table 4: Test the Validity of Reform

Wave	1995 (1)	2002 (2)
Retired	-0.535*** (0.117)	-0.0793 (0.0903)
Retired*Original Replacement Rate	0.432*** (0.149)	0.0309 (0.111)
Observations	5,714	5,666

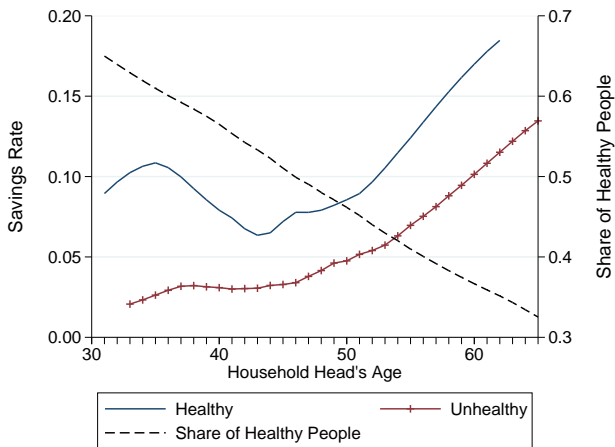
[◀ back](#)

Figure 25: Age Pattern of Transfer Expenditure in 2002



Source: Chinese Household Income Project, 2002.

Figure 26: Age Pattern of Chinese Saving Rate by Health Status

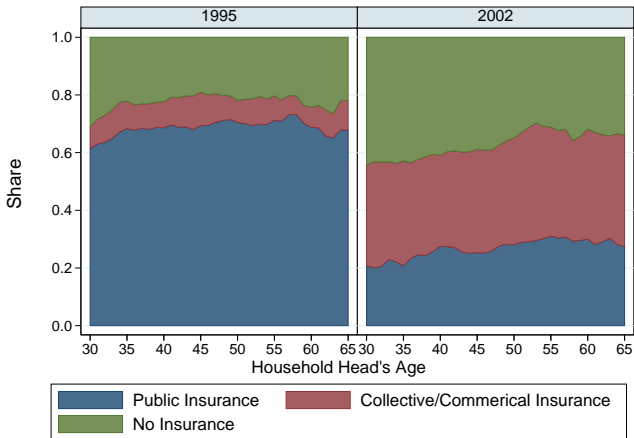


Source: Chinese Household Income Project, 2002.





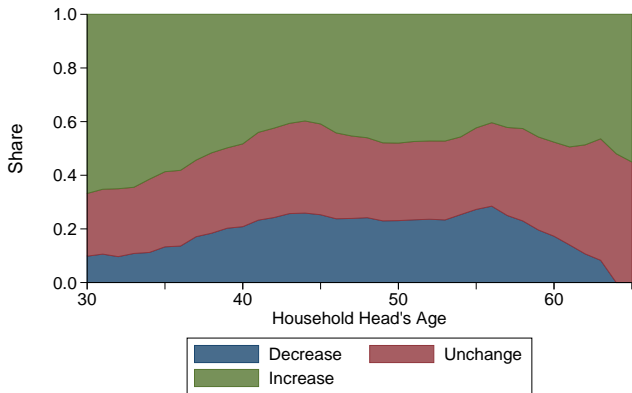
Figure 28: Type of Medical Insurance by Survey Years



Source: Chinese Household Income Project, 1995, 2002.

[◀ back](#)

Figure 29: Expectation of Future Income Change (2002)



Source: Chinese Household Income Project, 2002.

◀ back

# Identification Strategy

- Relative risk aversion ( $\nu$ ) -  $\nu$  can be identified by how people value current consumption compared to future consumption. If people are highly risk averse, they will tend to have higher current consumption since future has uncertainty.
- Strength of bequest motive ( $\theta_1$ ) -  $\theta_1$  can be identified by the difference in saving rates between families with children and families without child.

- Strength of bequest motive ( $\theta_0$ ) -  $\theta_0$  can be identified by the amount of assets at the end of life cycle, which is equivalent to total amount of saving through out life cycle conditional on initial assets.
- Preference shifter ( $\delta_1, \delta_2, \delta_3$ ) - these parameters can be identified by the correlation between consumption and corresponding factors (leisure, health) and their interaction. [◀ back](#)