




Financial Literacy, Portfolio Choice and Financial Well-Being

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Accepted: 18 March 2016 / Published online: 23 March 2016
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Abstract This study examined potential effects of financial literacy on household portfolio choice and investment return, an indicator of financial wellbeing. Using data from the 2014 Chinese Survey of Consumer Finance, financial literacy was measured and further categorized into basic financial literacy and advanced financial literacy. This study tested the hypothesis that financial literacy affects household choice between stock and mutual fund. The results indicated that households with higher financial literacy, especially those with higher level of advanced financial literacy tended to delegate at least part of their portfolio to experts and invest in mutual fund. However, households who were overconfident about their financial literacy tended to invest by themselves and were more likely to hold only stocks in their portfolios. The findings also indicated that households with higher financial literacy had a better chance of receiving a positive investment return, suggesting that higher financial literacy may result in a better financial outcome.

Keywords Household finance · Financial literacy · Overconfidence · Financial well-being

1 Introduction

Financial products are everywhere in our modern life. The rapid spread of financially complex products is increasingly requiring people to decide how much to save and where to invest and, during retirement, to take on responsibility for careful decumulation so as not to outlive their assets while meeting their needs, which requires households to be

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well-equipped with financial literacy. However, low financial literacy is found among consumers in many countries (Lusardi and Mitchell 2014).

There are various literatures linking financial literacy with economic decisions. It has been shown that households with high financial literacy do better in financial and retirement planning (Lusardi and Mitchell 2005; Lusardi and Mitchell 2007). Also they perform better in credit card usage and dealing with debt (Disney and Gatherer 2016; Mottola 2013). There are also evidences showing a strong relationship between financial knowledge and the likelihood of engaging in desirable financial practices: paying bills on time, tracking expenses, budgeting, paying credit card bills in full each month, saving out of each paycheck, maintaining an emergency fund, diversifying investments, and setting financial goals (Hilgert et al. 2003). Also financial literacy is found to contribute positively to financial satisfaction (Xiao et al. 2014; Ali et al. 2014).

On the other hand, low financial literacy is associated with poor financial decisions in equity investment, debt financing, as well as long term retirement planning and these decisions can lead to decrease in welfare. Individuals with lower level of financial literacy are less likely to participate in stock market (Kimball and Shum 2006; Van Rooij et al. 2011; Yoong 2011) and thus can forgo the substantial equity gain (Cocco et al. 2005). Households with lower level of financial literacy can also make suboptimal decisions when choosing loans or mortgages (Lusardi and Tufano 2008; Utkus and Young 2011; Moore 2003), and suffer from problems such as debt accumulation (Lusardi and Tufano 2008), bankruptcy and foreclosure (Gerardi et al. 2010).

Financial literacy has not yet been directly linked to how household choose among different kinds of assets. There are literatures about household financial choices and diversifications, however, using trading data, researchers failed to measure financial literacy accurately (Bailey et al. 2006). In this study, we used data from the 2014 Chinese Survey of Consumer Finance and focused on household's choice between the two risky assets, stock and mutual fund. The survey covered nearly all provinces of China and included questions about household's asset and debt, income and expenditure, financial plans as well as financial literacy. The section of financial literacy in the survey provides opportunities to link financial literacy with other household financial outcomes. The unique contributions of this study are using refined measurements for financial literacy and directly linking financial literacy to household financial decisions. The research results indicate that people with higher financial literacy, especially those who understand advanced financial knowledge well, tend to add mutual funds to their portfolio. Besides, we also propose a definition about the overconfidence in financial literacy. People who are overconfident about financial literacy tend to only invest in stock. Finally, positive portfolio return, an indicator of household financial wellbeing, is found to be linked to financial literacy.

This paper is organized as following: in Sect. 1 we present an overview of Chinese financial market. In Sect. 2, we provide a review of related literature and present hypotheses. In Sect. 3, we describe the data and variables. In Sect. 4 we discuss the results. In Sect. 5, we present results of robustness check using an alternative way to calculate financial literacy. In the last section, we conclude with a brief discussion.

2 Overview of Chinese Financial Market

China's stock market was established around 1992 and has grown in at a phenomenal pace since then: the number of listed stocks was 13 and the aggregate market capitalization was US\$1.3 billion in 1991 (Eun and Huang 2007), while the number of listed stocks increased to 2800 and the aggregate market capitalization has risen to more than US\$7 trillion by the end of 2015 (China Securities Regulatory Commission 2015). However, China has only slowly developed a legal framework for stock markets and has a weak law enforcement record, which played at best a marginal role in China's market development (Pistor and Xu 2005). There are evidences showing that China's stock markets are not efficient in that prices and investors' behavior are not necessarily driven by fundamental values of listed firms (Allen et al. 2012). Morck et al. (2000) found that stock prices are more "syn-

avoid risk. However, there are also research findings showing that the Chinese are more risk tolerant than Americans in their financial decisions which may also due to culture reasons (Fan and Xiao 2006; Weber and Hsee 1998). Therefore, the culture difference may affect financial decisions of Chinese households.

3 Prior Research and Hypotheses

Traditional consumption theories such as the life cycle hypothesis (Modigliani and Brumberg 1954) and permanent income hypothesis (Friedman 1957) assume that individuals have the capacity to undertake complex economic calculations and to have expertise in dealing with financial markets (Lusardi and Mitchell 2014). Lusardi et al. (2013) construct a multi-period dynamic life cycle model where individuals not only select capital market investments, but also undertake investments in financial knowledge and people would pay a certain amount to obtain more financial knowledge. Their conceptual model suggests that higher financial literacy is associated with better investment portfolio choices and outcomes.

3.1 Choice Between Stock and Mutual Fund Investing

Consumers with low financial literacy may seek financial advice in investment. Financial advising plays an important role here. For people that are not good at dealing with complex financial products, they can turn to financial advisors for help. Financial institutions could provide products and processes to improve the financial wellbeing of their customers (Vlaev and Elliott 2013). A substitute for financial advice, although not a perfect one, is mutual fund. Households can pay a fee and delegate part of their portfolio to mutual fund managers, who are well educated in finance, and usually have rich experience of investing in a specific field. Research literatures show that mutual fund managers do a good job in both stock selection (Elton et al. 1996; Daniel et al. 1997; Carhart 1997) and timing ability (Jiang et al. 2007; Kaplan and Sensoy 2008; Elton et al. 2012). As for mutual fund performance, it has been documented that risk adjusted returns of mutual fund, net of fees and expenses are comparable to returns of the market return (Ippolito 1989), and the vast majority (80 %) of active managers having at least enough skills to cover their fees (Berk and Green 2004).

Without the help of professional financial adviser, how do households with different levels of financial literacy make their portfolio decisions? First, we considered the participation problem. According to the financial theory, even households with relatively low risk tolerance should participate, to some degree, directly or indirectly, in the stock market (Campbell 2006). However, many families have failed to participate in risky asset market. One explanation is that different households have different preferences about risk or uncertainty, some are extremely loss avert and resist to participate (Barberis et al. 2006). Ambiguity aversion could also lead to under-participation (Dimmock et al. 2013). Another explanation is that investors have different expectations about the future return of stocks, in which some believe their risk adjusted return is just below zero. Hurd et al. (2011) find that expectations do affect household stock market participation. Those who are more optimistic are more likely to participate in stock market (Puri and Robinson 2007). Moreover, another popular explanation is that families fail to join the stock market because they are presented with fixed cost (Vissing-Jørgensen 2004). The costs include monetary cost and information cost, and a household makes the decision to participate based on the tradeoff

between the cost and return. And therefore, factors that could change the participation cost could also influence household participation choice. Monetary cost usually includes income and wealth (Calvet et al. 2007). For information cost, several factors are considered to be linked with the participation puzzle: cognitive ability (Christelis et al. 2010; Grinblatt et al. 2011; Agarwal and Mazumder 2013), awareness of stocks (Guiso and Jappelli 2005), education level (Cole et al. 2014) and social interactions (Hong et al. 2004). Background risk can be another factor that influences risky asset participation. Heaton and Lucas (2000) find that background risks from sources such as entrepreneurial income influence portfolio allocations. Age and home ownership are also related background risk factors and thus influence participation (Cardak and Wilkins 2009). Household financial literacy may be considered as another background risk factor.

3.2 Financial Literacy and Portfolio Choice

In this study, we focused on the role of financial literacy in consumer decisions on choosing stock or mutual fund, which are the two most popular risky assets in China. As mentioned in the Sect. 2, under the background of Chinese financial markets, financial advising service is rare and therefore financial literacy plays an important role here. We propose two competing hypotheses below:

H_{1a} Households with higher financial literacy are more likely to invest in stocks directly.

H_{1b} Households with higher level of financial literacy are more likely to delegate part of their portfolios to fund managers and invest in mutual funds.

H_{1a} is justified because that they have confidence in their own financial knowledge and the trading cost of direct stock investing are much lower than investing in mutual fund. The competing hypothesis is based on the saying that the more wit, the less courage. Investing in risky assets is a complex task, and people who know less about the potential risk could be more aggressive and do direct stock investment, which is also much easier than mutual fund trading in Chinese financial markets. However, people who are equipped with more financial knowledge are more careful about direct investment since they know that compared to stock, mutual fund is more diversified in the first place. Also, regulations and rules in China require mutual fund managers to fully diversify their portfolios. And thus people with high level of financial literacy choose to delegate part of their money to mutual funds, to give more diversification to the portfolio and earn profit from experts managed investment, although they have to pay extra management fees.

There are mixed evidences from the research literature. The H_{1a} is supported by several studies. Kormiotis and Kumar (2013) find that “smart” investor possess more related information and tend to hold concentrated portfolios with only a handful of stocks. Bailey et al. (2006) find that investors who are smarter or are with stronger behavioral biases, a preference for gambling, or residence in states where lotteries are popular, tend to choose stock. Alessie et al. (2004) conclude that mutual fund is particularly attractive for investors with little financial knowledge.

However, Gaudecker (2015) finds that people with below-median financial literacy trust their own decision-making capabilities and lose an expected 50 basis points (0.5 %) on average. And this finding supports H_{1b} that people with high level of financial literacy choose to delegate part of their money to mutual funds and household with little knowledge choose to invest on their own. Van Rooij et al. (2011) show that those who display high levels of financial literacy are more likely to rely on formal sources such as newspapers,

financial advisors, and the internet. Therefore, if mutual fund acts as the substitute of financial advice, we can infer that households with high level of financial literacy will choose to invest in mutual fund, which supports H_{1b} .

3.3 Financial Literacy Overconfidence and Portfolio Choice

In this study, we also examined whether financial literacy overconfidence affects household portfolio choice. The financial literacy overconfidence is defined based on the difference between perceived financial literacy and subjective financial literacy. And this is a supplement for the first and main topic which discusses the financial literacy and portfolio choice. Overconfidence has been linked with over trading in stock market (Barber and Odean 2001; Grinblatt and Keloharju 2009). However, its relationship with portfolio choice between stock and mutual fund has not been fully addressed. Bailey et al. (2006) find that unsophisticated investors who have an illusion of control, which may be generated by overconfidence, prefer individual stocks. Also there is evidence that financial literacy overconfidence is correlated with higher possibility of stock market participation (Xia et al. 2014). We therefore propose the following hypothesis:

H2 Overconfident consumers are more likely to hold stocks instead of mutual funds.

3.4 Financial Literacy and Investment Return

We also took financial wellbeing into consideration in this study. Financial wellbeing has been defined in various way, such as retirement planning (Lusardi and Mitchell 2005), financial management (Lusardi and Mitchell 2007; Vlaev and Elliott 2013), capability of dealing with debt (Tsai et al. 2014) and financial satisfaction (Ali et al. 2014; Xiao et al. 2014). In this study, we consider the household portfolio performance as an indicator of financial wellbeing, which is also the result of household portfolio choice. There are inconsistent results in literatures about how financial literacy could affect household portfolio performance. Calvet et al. (2007) find that financially sophisticated households invest more aggressively, and overall they incur higher return losses from under-diversification. However, Gaudecker (2015) shows that nearly all households that score high on financial literacy achieve reasonable investment outcomes. In Korniotis and Kumar (2013), results indicate that “smart investors,” who are more financial sophisticated outperform dumb investors by about 3 % annually on a risk-adjusted basis. As it is discussed in Sect. 2, Chinese stock market has suffered from great variation, and financial literacy may play an important role in household portfolio performance. And similar to other kind of financial wellbeing, we propose a hypothesis as follows:

H3 Positive return of the investment portfolio is positively associated with financial literacy.

4 Methodology

4.1 Data

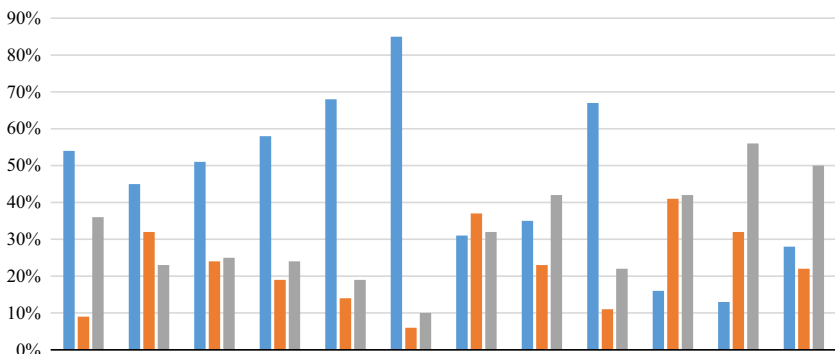
We used data from the 2014 Chinese Survey of Consumer Finance sponsored by China Center for Financial Research and carried out by the Institute of Social Science Survey

(ISSS). The survey covers nearly all the provinces of mainland China and includes questions about household’s asset and debt, income and expenditure, financial plans as well as financial literacy. The survey included 3906 households living in 25 provinces of mainland China, except for Xinjiang, Tibet, Qinghai, Inner Mongolia, Ningxia, and Hainan. Designed by an interdisciplinary group of scholars, the survey collected a sample representative of the national population. The survey covers 1 % of the nation’s total population, selected by a stratified multi-stage clustering sampling method from the Population Census, with the strata set at the provincial level and the ultimate sampling unit set at the residential community level. (Gao et al. 2014; Li and Wu 2014). More details of the survey and data are described in Xie and Hu (2014).

4.2 Measures of Financial Literacy

Financial literacy was measured with information from the answers to 12 questions about some financial knowledge. And the specific questions are included in the “Appendix”.

The twelve questions were further divided into two categories following Van Rooij et al. (2011). One set of questions is about basic financial knowledge where no questions are about the stock market, stocks, and bonds. The other set of questions are about more advanced financial knowledge as well as knowledge related to stocks, the stock market, and other financial instruments. The survey questions measuring financial literacy in the 2014 Chinese Survey of Consumer Finance are very similar to those used in Van Rooij et al. (2011) except for the question about the central bank. The first seven questions were used to measure basic financial literacy and the last five questions measured advanced financial knowledge. In data analyses, we used several variables to measure household financial literacy. We first introduced a general measure of financial literacy (variable *FL*), represented by the total number of correct answers out of the twelve questions. Then we



created two refined measures of financial literacy, FL_{basic} and $FL_{advance}$. FL_{basic} measures the basic knowledge, represented by the right answers out of the first seven questions, while $FL_{advance}$ measures the advance knowledge, represented by the right answers out of the last five questions.

Figure 1 reports the proportion of households providing correct, incorrect, and “do not know” answers to each of the twelve basic literacy questions. According to Fig. 1, the households in the sample have good grasp of common financial questions, such as high return is accompanied by high risk and money has time value, in which 85 % of respondents provide the right answer to the relationship between risk and return and 68 % of respondents knows money today is more worthy than the same amount of money next year. However, when it comes to questions like “the risk of stock” and “the meaning of holding stocks,” the percentages of correct answers dropped sharply and the percentages of “do not know” reply increased. Only 13 % households answered the question about mutual fund correctly, while 16 % knew what the rights and responsibilities of holding stocks are. 42 % household could not compare the risk between mutual fund mainly investing in stock and those mainly investing in bond.

For financial literacy variables, the mean of variable FL is 5.49. Only 1 % respondents get all 12 questions right, while 5.61 % of all respondents give wrong answers to all 12 questions. For the basic knowledge part, the maximum value of FL_{basic} is 7, and the mean value is 3.90. For advance knowledge part, the maximum value of $FL_{advance}$ is 5, while the mean value is 1.59.

4.3 Financial Asset Holding Variables

In this study, we focused on stock and mutual fund holdings in household portfolios. We used the dummy variable $stock$ to indicate whether a household holds stocks and used $mutual$ to indicate mutual fund holding. And we used $asset$ to indicate whether a family holds stock, mutual fund, or both, which represents whether the household participates in the financial market.

The summary statistics of these variables are presented in Table 1. Only 13.4 % households held stocks and/or mutual funds, and about 10 % held stocks. For mutual fund holding, the percentage (5.5 %) is just about half of stock holding. And these rates are very close to those reported by Gan (2013) who used another national survey of consumer finance in China. Therefore, there is participation puzzle (Haliassos and Bertaut 1995) in the China stock market, since the participation rate is relatively low. Also, it seems that stock is more popular than mutual fund among Chinese households.

Table 1 Household portfolio holding choice and percentage

Household choice	Frequency	Percentage (%)
Participate into at least one asset	522	13.36
Stock holding	397	10.16
Fund holding	216	5.53
Only stock holding	306	7.83
Only fund holding	125	3.56
Holding both stock and fund	91	2.33

Source: Own calculation based on the financial asset section of 2014 Chinese Survey of Consumer Finance

4.4 Control Variables

In this study, we also included several control variables, which according to the literatures, may affect portfolio decisions. Age may affect household participation choice in two aspects. On the one hand, age may affect cognitive ability which has been shown to affect household financial decision making (Christelis et al. 2010; Grinblatt et al. 2011; Agarwal and Mazumder 2013). On the other hand, the elderly are faced with more health problems and therefore have higher background risk which affect family's participation in risky asset (Cardak and Wilkins 2009). Also, the square of age is included due to the life cycle hypothesis, which is also related to the asset allocation decision. In the dataset, the age variable refers to the age of the family member who answers financial literacy questions. And the family member is supposed to be responsible for household investment decision.

We also included gender. According to Lusardi and Mitchell (2008) gender differences are found in long-term financial planning. Also males are more prone to participate in risky investment due to overconfidence (Barber and Odean 2001). The gender variable is a dummy one, 1 represents male, 0 female. 45 % of the respondents are male. Similar with age, the gender variable refers to the gender of the family member who answers the financial literacy questions. The average value of the age variable is 50.42.

We also included income and business owning status to control for the background risk (Heaton and Lucas 2000). The income variable represents the income of the household in the last 12 months. The mean value of income 71867.35 renminbi yuan. The natural logarithm value of income was used in the analyses. The business owner variable is a dummy one, 1 means there are family members who own a business. 13 % of the households have their own businesses. We also included housing condition variable that may affect household background risk. There are four types of living conditions: own or partial own the house, special house provided by the government, rent the current house or other types. We included dummy variables for these types and control for the potential background risk.

Risk attitude may affect household portfolio choice (Vissing-Jørgensen and Attanasio 2003; Barberis et al. 2006), and we included the risk attitude variable as a control variable. The higher the value, the more risk averse the household is. If the value is 1, the respondent prefers products of both high risk and high return. If the value is 4, the respondent is extremely risk averse and would not like to take any risk at all. 45 % of the respondents would not like to take any risk at all, and the mean value of the risk attitude is 3.

We also included family size, which negatively affects the average income per family member (Chen and Yang 2015) and thus could affect household portfolio choice. The mean value of the family size is 3.20. Besides we also included marriage status following previous research on risky asset participation (Xia et al. 2014; Grinblatt et al. 2011). The variable marriage is a dummy variable, where 1 represents the respondent is married.

4.5 Empirical Strategy

We proposed two competing hypotheses. One hypothesis is that people with higher financial literacy are more likely to choose to invest by themselves and invest in stock directly. The other is "the more wit, the less courage" hypothesis: household with higher level of financial literacy are more likely to choose to delegate at least part of their money to mutual funds.

In the model proposed by Georgarakos and Inderst (2011), the process of household decision making is generalized into a two steps game: people first decide whether to participate in financial market and then decide how to choose between two risky assets. It is assumed that for a given investor both products can be equally suitable, though actually only one provides the best “fit.” The expected utility from a suitable product is denoted by U_h , that from a non-suitable product by the strictly lower utility U_1 . The investor’s expected utility from choosing the safe and less complex product is denoted by U_0 . Since the authors solve the game backwards, the second step is considered first. Investors with different levels of perceived financial literacy have different distributions of posterior belief and thus have distinct probabilities of choosing a certain asset in the second step. The investor then compares the expected utility (U^*) of the second step with U_0 , and will only participate if the expected utility is larger than U_0 . It can be derived from the model that $U^* - U_0$ are larger when perceived financial capability is higher. And thus perceived financial literacy influences both steps.

We followed the approach of Georgarakos and Inderst (2011). However we used objective financial literacy rather than the perceived financial literacy here. There are two reasons we used objective financial literacy here. First of all, objective financial literacy is more accurately measured in the survey. The choice of the households concentrated in the middle level (average level of financial literacy or below average) which may not accurately reflect the true level of financial literacy, and this may be due to the tradition of Chinese to choose to “stay in the middle”. Second, most financial literacy studies use objective financial literacy if they use survey data as it is in this research (Hung et al. 2009; Hastings et al. 2013). And we will discuss the perceived financial literacy in the next session.

For the first step, we considered the two risky assets; stock and mutual fund as a whole, and included the financial literacy variable and controls for other related factors. And it can be modeled by Eq. (1).

$$\Pr(\text{Participation} = 1) = \alpha + \beta \text{ financial literacy}_h + \gamma' Z_h + \delta_0 + \varepsilon \tag{1}$$

where “h” represents the index of the household. The way we measured financial literacy has been discussed in Sect. 3. And Z represents the vector of demographic characters. ε is the error term. We use $\Pr(\alpha + \beta \text{ financial literacy}_h + \gamma' Z_h + \delta_0 > 0)$ to represent the chance that household participate in financial market.

For the second step, households decide which asset they want to buy, stock or mutual fund. And we used Eq. (2) to estimate how different factors affect the choice between stock and fund.

$$\Pr(\text{fund_holding} | \text{Participation} = 1) = \alpha + \beta \text{ financial literacy}_h + \gamma' Z_h + \delta_0 + \varepsilon \tag{2}$$

We used Probit model to estimate Eqs. (1) and (2) in empirical test. The link between the two equations is that, for Eq. (1), all households are included, while only households who choose to participate in Eq. (1) are considered in Eq. (2). And the reason we do this is that only households who choose to participate in the first step can actually choose between the two assets.

If the hypothesis that people with high financial literacy choose to invest by themselves and invest in stock directly is right, the coefficient β should be negative, since household with higher financial literacy simply want to invest all by themselves and not delegate it to others. And they would not like to invest in mutual fund. If the opposite is true, β should be positive.

5 Results

5.1 Financial Literacy and Market Participation

We estimated Eq. (1) using the Probit model. We used two sets of measures of financial literacy. The first set includes *FL* that was to measure financial literacy as a whole. And the second set included *fl_ba* and *fl_ad* that measure basic financial knowledge and advance financial knowledge, respectively. The results are shown in Table 2.

In column (1) and (3) of Table 2, we used the *FL* measure of financial literacy and column (2) and (4) *fl_ba* and *fl_ad*. First, we did not include control

Table 2 Multivariate analysis of market participation: Probit results

	(1) Participation	(2) Participation	(3) Participation	(4) Participation
FL	0.195*** (0.0109)		0.170*** (0.0141)	
Financial_basic		0.147*** (0.0179)		0.112*** (0.0210)
Financial_adv		0.262*** (0.0231)		0.258*** (0.0276)
Age			0.110*** (0.0152)	0.113*** (0.0152)
Agesquare			-0.000935*** (0.000147)	-0.000953*** (0.000147)
Logincome			0.361*** (0.0474)	0.365*** (0.0474)
Business owner			-0.199** (0.0997)	-0.198** (0.100)
Gender			-0.281*** (0.0642)	-0.287*** (0.0644)
Risk attitude			-0.263*** (0.0371)	-0.255*** (0.0373)
Family size			-0.0920*** (0.0270)	-0.0922*** (0.0271)
Marriage status			-0.119 (0.105)	-0.112 (0.105)
Province control variables			Yes	Yes
Living condition control variables			Yes	Yes
_Cons	-2.346*** (0.0794)	-2.264*** (0.0816)	-7.814*** (0.702)	-7.881*** (0.704)
<i>N</i>	3906	3906	3654	3654
<i>Pseudo R</i> ²	0.126	0.129	0.276	0.281

Standard errors in parentheses, * < 0.1, ** < 0.05, *** < 0.01

variables. The results in column (1) and (2) indicate that, financial literacy, in both two sets of measurements is significantly associated with financial market participation. After control variables were entered, the coefficients and significance levels of financial literacy variables are nearly unchanged. Van Rooij et al. (2011) find that households with higher financial literacy are more likely to participate. And the regression results are consistent with the previous study. In addition, age has a U shape effect on participation, the coefficient of age is positive and significant, while the coefficient of age square is negative and significant. This implies that as age increases investors participate more, however, when it comes to a certain point (for column (3) 59 years old and 60 for column (4)), the probability of participation drops. This U shape effect may be the combine effect of age on cognitive ability and background risk. Most Chinese workers retire at the age of sixty, some face great decline of income. And the probability of getting a disease is higher than the younger workers. The cognitive ability can also decay due to aging. All these factors can affect household market participation. Self-employed respondents are less likely to participate in the financial market. And this may be due to the fact that they have already

Table 3 Multivariate analysis of mutual fund holding and return: Probit results

	(1) Fund_holding	(2) Fund_holding
FL	0.0542* (0.0289)	
Financial_basic		0.00492 (0.0444)
Financial_adv		0.117** (0.0522)
Age	0.0234 (0.0341)	0.0277 (0.0343)
Agesquare	-0.000146 (0.000333)	-0.000186 (0.000334)
Logincome	0.0455 (0.0888)	0.0429 (0.0888)
Business owner	0.196 (0.195)	0.189 (0.195)
Gender	-0.226* (0.122)	-0.237* (0.123)
Risk attitude	0.213*** (0.0772)	0.219*** (0.0773)
Family size	0.0568 (0.0608)	0.0572 (0.0608)
Marriage status	-0.224 (0.217)	-0.230 (0.218)
Province control variables	Yes	Yes
Living condition control variables	Yes	Yes
_Cons	-1.642 (1.433)	-1.634 (1.433)
<i>N</i>	509	509
<i>P</i> < . <i>d</i> <i>R</i> ²	0.0614	0.0645

Standard errors in parentheses,

* < 0.1, ** < 0.05,

*** < 0.01

face great risk. According to the result, risk aversion is also associated with participation (the coefficient is negative significant), the more risk averse, the less likely to participate. And this result is consistent with Calvet et al. (2007).

5.2 Financial Literacy and Portfolio Choice

We also tested the two hypotheses by estimating Eq. (2). And the result is presented in Table 3. The results of the first column indicate that households with general high financial literacy are more likely to choose mutual fund when they make their portfolio choice. While when we turned to the result in column (2), in which we separated financial literacy into two parts, we found that only advanced financial literacy was associated with mutual fund holding. And the coefficient is larger than that of general financial literacy (*FL*). This means that getting one more question right in advance financial knowledge section has twice the effect of getting one more question right in the general financial literacy section on the participation of mutual fund. The results suggest that we should reject the hypothesis that people with high financial literacy just choose to invest by themselves and invest in stock directly, because the estimation of the financial literacy coefficient is positive and significant in both the two sets of measurements. And this means that the famous saying “the more wit, the less courage” also works here. Also, advanced financial literacy corresponds to questions about risk and financial market, which implies that households who understand the market and risk well are more prone to invest in mutual fund. We also found that the coefficient of gender is negative and significant. And this indicates that males are less likely to invest in mutual fund and are more likely to invest only in stock, consistent with previous research in which males are more likely than females to have behavior bias due to overconfidence (Barber and Odean 2001). Besides, the coefficient of risk attitude is positive and significant, which suggests more risk averse households would tend to invest in mutual fund, matching the diversification function of mutual fund.

5.3 Confidence or Overconfidence

In this section, we provide an explanation to the question that if households with higher financial literacy tend not to invest in stocks, what are other households that do it? Georgarakos and Inderst (2011) argue that investors use the perceived financial literacy to make financial decision. In the survey used in this study, there are five levels of perceived financial literacy for the respondents to choose, from level 1 to level 5, and level 1 means

Table 4 Answer distribution of perceived financial literacy

Answers	Frequency	Percent (%)
Level 1: Far above average	31	0.79
Level 2: Above average	199	5.09
Level 3: Average level	1552	39.73
Level 4: Below average	1590	40.71
Level 5: Far below average	467	11.96
Refuse to answer	1	0.03
Do not know	66	1.69

S ^c Own calculation based on the financial literacy section of 2014 Chinese Survey of Consumer Finance

the respondent thinks her/his level of financial literacy is far beyond average, and level 5 represents far below average. And the distribution of the answers is listed in Table 4.

We first used Eqs. (1) and (2) to test the effect of perceived financial literacy. The results are listed in Table 5. In column (1) and (2), the results indicate perceived financial literacy may affect participation while the effect on the portfolio choice is insignificant. We then used a dummy variable to represent whether the respondent thinks he or she has above average financial literacy. And the result in column (3) and (4) are similar to (1) and (2).

Table 5 Effect of perceived financial literacy and overconfidence on stock holding: Probit result

	(1) Participation	(2) Stock_not_fund	(3) Participation	(4) Stock_not_fund	(5) Stock_not_fund
Perceived financial literacy	0.127*** (0.0394)	0.000559 (0.0775)			
Above average perceived financial literacy			0.303*** (0.107)	0.0577 (0.186)	
Over_confidence					0.276* (0.149)
Age	0.105*** (0.0147)	-0.0238 (0.0341)	0.103*** (0.0147)	-0.0243 (0.0341)	-0.0132 (0.0352)
Agesquare	-0.000957*** (0.000143)	0.000182 (0.000333)	-0.000942*** (0.000142)	0.000187 (0.000333)	0.0000847 (0.000342)
Logincome	0.466*** (0.0453)	-0.0705 (0.0887)	0.472*** (0.0452)	-0.0736 (0.0884)	-0.0428 (0.0909)
Business owner	-0.273*** (0.0967)	-0.174 (0.194)	-0.280*** (0.0968)	-0.174 (0.194)	-0.177 (0.203)
Gender	-0.161*** (0.0613)	0.184 (0.121)	-0.162*** (0.0613)	0.181 (0.121)	0.158 (0.126)
Risk attitude	-0.344*** (0.0356)	-0.175** (0.0773)	-0.356*** (0.0351)	-0.172** (0.0758)	-0.183** (0.0773)
Family size	-0.118*** (0.0258)	-0.0525 (0.0607)	-0.119*** (0.0257)	-0.0522 (0.0606)	-0.0429 (0.0624)
Marriage status	-0.0321 (0.102)	0.192 (0.220)	-0.0320 (0.102)	0.198 (0.220)	0.236 (0.223)
Province and living condition control variables	Yes	Yes	Yes	Yes	Yes
_Cons	-7.420*** (0.677)	1.382 (1.419)	-7.255*** (0.674)	1.421 (1.425)	0.593 (1.470)
N	3601	507	3601	507	472
Pseudo R ²	0.225	0.0558	0.224	0.0560	0.0642

Standard errors in parentheses, * < 0.1, ** < 0.05, *** < 0.01

Therefore, using this data set we cannot verify that if perceived financial literacy affect how households choose between the two different financial assets.

To further examine the issue, we used a measure of financial literacy overconfidence following Xia et al. (2014):

- (1) Respondents who think their financial knowledge is at average level or above.
- (2) Respondents whose actual financial literacy (measured by FL) is below the average level (7.7).

Table 6 Effect of financial literacy on positive return: Probit results

	(1) Positive_return	(2) Positive_return	(3) Positive_return
FL	0.00472 (0.0342)		
Financial_basic		-0.103* (0.0542)	
Financial_basic above median			-0.277 (0.173)
Financial_adv		0.135** (0.0614)	0.117** (0.0596)
Age	-0.0791** (0.039)	-0.0741*	-0.0724*
	--	eo-20.43	

The two criteria should be both satisfied to be recognized as overconfidence. We then used the overconfidence dummy variable to estimate whether overconfidence affects portfolio choice. And the dependent variable is a dummy variable indicates whether the households only invest in stock. And the regression result is shown in column (5) of Table 5.

The regression result shows that households who are overconfident about their financial knowledge are more likely to hold stock in their portfolio. Furthermore, this can be interpreted as that consumers who are overconfident in financial literacy choose to pick stocks by themselves rather than by some mutual fund managers. Therefore, it is not those who perceive to have high level of financial literacy are investing only in stock, but those who overestimate their financial literacy levels.

5.4 Financial Literacy and Portfolio Return

Next, we went to further by testing whether households with higher financial literacy actually do better in investment. It is the portfolio performance that really matters for financial wellbeing. We used a dummy variable Profit_{it} to indicate whether households make a profit in investment. We used Probit model similar to Eq. (2), and only change the dependent variable into positive return dummy. The result is shown in Table 6.

We found that households with higher advance financial literacy tended to receive positive return. And this suggests that financial literacy may contribute to good financial performance. However, the effect of general financial literacy are not significant, which suggests that advance financial literacy which concentrates more on the understanding of risky assets matters more for a better portfolio performance. The coefficient of basic financial literacy (-0.103) is negative, which is a little bit counterintuitive. One possible reason may be that the score of basic financial literacy concentrated in 5, 6 and 7 (72.8 %). Lack of variation could bring errors to the estimation of the coefficient. We therefore constructed a dummy variable for above median basic financial literacy (the median of all the risky asset participants is 5), and did the estimation again and the results are shown in the column (3) of Table 6. The coefficient of basic financial literacy is not significant while the coefficient of advance financial literacy is still positive and significant.

6 Robustness Check and Further Discussion

The method of measuring the financial literacy used in this study has been also used in other studies in the financial literacy literature. Lusardi and Mitchell (2005) and Van Rooij et al. (2011) used the method of factor analysis to construct two financial literacy indices. For robustness check, we did it similarly and constructed two indices, ac_ba_c and ac_ad_c . ac_ba_c was built on question 1–7, and ac_ad_c was built on the answers to question 8–12. The higher the factor is the higher financial literacy indicates.

We used the two indices to replace our financial literacy variables and estimated the equations again. And the results are shown in Table 7. The results are nearly unchanged comparing to the previous empirical results. We found that advance financial literacy still have significant and positive influence on mutual fund participation. And our conclusion is not changed.

Considering the fact that household who have extremely high income have the possibility to hire a financial advisor, which may have different financial behaviors from our assumption. We therefore doing all the estimation again by excluded the top 5 %

household who have relatively high income. And the result is shown in Table 8. And the coefficient and significance are nearly unchanged.

7 Conclusion

household financial wellbeing, which in this study refers to positive investment return. Using a Chinese national survey data, we find that households who have high level of financial literacy are more likely to participate in financial markets, which is consistent with previous studies (Kimball and Shumway 2006; Van Rooij et al. 2011; Yoong 2011). This results indicate that in the context of Chinese financial market, there is still correlation between financial literacy and risky asset investing behavior. Furthermore, we find that households with higher level of financial literacy are more likely to hold mutual fund in their portfolio. Just as the saying the more wit, the less courage, household who have higher level of financial literacy are more careful about direct investment. Additionally, households with higher financial literacy are more likely to earn positive return, which suggests that they actually do better. We also find that overconfident households are more likely to invest only in stocks instead of diversifying by investing in mutual funds.

There are mixed evidences in the literatures about the effects of financial literacy on choice between risky assets and portfolio performance. We used data from China where financial advising service is rare, and we therefore could remove the potential compounding effect of the financial advisors when investigating the effect of financial literacy. Although we use Chinese household data, however, the results may also hold in other countries, because “the more wit, the less courage” is an American saying there similar to a proverb in the Chinese culture. Our results about overconfidence complement the previous research on the link between overconfidence and financial behaviors and go further by studying the choice problem.

Previous research on financial literacy usually focuses on its potential effects on market participation, however, little research is done on its potential effects on financial outcomes. This study has filled in this research gap. Only 10 % of household in this survey participate into stock market, while the percentage is even smaller for mutual fund participation, which is only 5 %. For those who participate, less than one in four can receive positive return. Meanwhile financial literacy may improve the chance of “winning” in financial market. As we have mentioned in Sect. 2, Chinese financial market is not efficient enough, our research results indicate that investors have a big chance to suffer loss if not equipped with enough level of financial literacy. The results may also holds in other financial markets which are not efficient enough. With the fast development of global financial market, more and more households start to participate in risky financial markets. However, some are not well equipped with financial knowledge. And our results show the importance of increasing household financial literacy, which may help consumers make wise decisions in portfolio choices and improve financial wellbeing. Although effects of current financial education programs are in debate, financial literacy itself should be paid more attention by governments and financial service businesses. Financial literacy has been brought into sight for the last two decades and some developed countries like United States and United Kingdom have introduced financial education programs at various levels. Developing countries like China with a growing financial market could learn successes and lessons experienced by them.

Acknowledgments The authors acknowledge funding support from the National Natural Science Foundation of China (71232003 and 71573147), Specialized Research Fund for the Doctoral Program of Higher Education (20120002110085) and China Postdoctoral Science Foundation (2015M570066). The authors would also like to thank Hong Zhang and Bibo Liu for their comments and suggestions.

Appendix: Financial Literacy Questions in 2014 Chinese Survey of Consumer Finance

The survey was conducted in Chinese. Questions are designed according to financial literacy questions in OECD consumer finance survey (Atkinson and Messy 2012) and Survey of Consumer Finances (SCF) in the US. In this study, except for question 7, the questions are all come from the OECD consumer finance survey and Survey of Consumer Finances (SCF), only names and the numbers are changed. Question 7 is developed by the research team of China Center for Financial Economic.

1. One-year deposit interest rate: What is your estimation of one-year deposit interest rate?
(1) Below 1 % (2) 1–5 % (3) 5–10 % (4) 10 % and above (9) Do not know
2. Interest calculation: If you save 10,000 yuan in the bank for 1 year and the annual saving rate is 3 %, how much will get after one year?
(1) 10,300 (2) more than 10,300 (3) less than 10,300 (9) Do not know
3. Interest compounding: In the last question, if you continue saving the total amount you get for another year, how much will you get?
(1) 10,600 (2) more than 10,600 (3) less than 10,600 (9) Do not know
4. Inflation: If the annual saving interest rate is 3 %, and the inflation rate is 5 %. After 1 year, using the same amount of money, you will buy:
(1) more things than now (2) equal things with now (3) less things than now (9) Do not know
5. Time value of money: If Zhang inherits 100,000 yuan today, and Li will inherit 100,000 yuan after 3 years, who get more value from the inheritance?
(1) Zhang (2) Li (3) They get the same value (9) Do not know
6. Investment risk: Usually high return investment also have high risk.
(1) Right (2) Wrong (9) Do not know
7. Central bank: Which bank has the currency policy making function?
(1) Bank of China (2) Industry and Commerce Bank of China (3) People's Bank of China (4) China Construction Bank (9) Do not know
8. The risk of stock: Generally speaking, invest in one stock is less risky than invest in Equity funds.
(1) Right (2) Wrong (9) Do not know
9. The risk comparison: Generally speaking, which of the following asset is most risky?
(1) Bank saving (2) Treasury bond (3) Stock (4) Mutual fund (9) Do not know
10. The meaning of holding stocks: What does it mean if you buy stocks of a particular company?
(1) No matter you hold the stock for a long term or a short term, you lend your money to the company
(2) No matter you hold the stock for a long term or a short term, you are the shareholder of the company
(3) You are shareholder when you hold for a long term, while you are only lenders if you only hold for a short while.
(4) All above are not right.
(9) Do not know

11. Mutual fund: Which of the following statement correctly describe mutual fund?
- (1) Mutual fund with lower net worth will get higher performance in the future
 - (2) Generally speaking, a mutual fund could invest in several kinds of assets, such as stock and bonds
 - (3) Generally speaking, mutual fund can promise you a positive return base on past performance
 - (4) All above are not right.
 - (9) Do not know
12. Stock market: Which of the following statements correctly describe the core function of stock market?
- (1) Stock market helps predict stock return
 - (2) Stock market helps increase stock price
 - (3) Stock market helps buyers and sellers of stocks
 - (4) All above are not right.
 - (9) Do not know

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