Gamblers as Personal Finance Activists

Geng Li

Federal Reserve Board

October 2013

Conference on Household Finance at the European Central Bank

Frankfurt am Main

The views presented here are those of the author and are not necessarily those of the Federal Reserve Board or its staff.

▲□▶ ▲圖▶ ▲臣▶ ★臣▶ = 臣 = のへで

- When do people gamble?
- Why do people gamble?
- Who are the gamblers?

- When do people gamble?
 - The relationship between gambling and income fluctuations
- Why do people gamble?
 - Gambling and other expenditure
- Who are the gamblers?
 - Not limiting to demographics
 - What are the behavioral traits gamblers have?
 - Observable implications of such behavioral traits

- When do people gamble?
 - The relationship between gambling and income fluctuations
- Why do people gamble?
 - Gambling and other expenditure
- Who are the gamblers?
 - Not limiting to demographics
 - What are the behavioral traits gamblers have?
 - Observable implications of such behavioral traits

• People tend to gamble when income is higher than its normal levels.

- When people gamble, other expenditures tend to be higher, not lower, likely due to higher income.
- On balance, gamblers do not appear to have a lower saving rate.
- Some people appear to perceive buying lotteries as making a donation (mental accounting).

- People tend to gamble when income is higher than its normal levels.
- When people gamble, other expenditures tend to be higher, not lower, likely due to higher income.
- On balance, gamblers do not appear to have a lower saving rate.
- Some people appear to perceive buying lotteries as making a donation (mental accounting).

- People tend to gamble when income is higher than its normal levels.
- When people gamble, other expenditures tend to be higher, not lower, likely due to higher income.
- On balance, gamblers do not appear to have a lower saving rate.
- Some people appear to perceive buying lotteries as making a donation (mental accounting).

- People tend to gamble when income is higher than its normal levels.
- When people gamble, other expenditures tend to be higher, not lower, likely due to higher income.
- On balance, gamblers do not appear to have a lower saving rate.
- Some people appear to perceive buying lotteries as making a donation (mental accounting).

- Active investors—owning stocks and a second home.
- Active borrowers: owe (various types of) debt and accumulate new debt.

▲□▶▲□▶▲□▶▲□▶ ▲□ ● のへで

- Actively manage their debt (refinance).
- Do not have a higher net worth.

- Active investors—owning stocks and a second home.
- Active borrowers: owe (various types of) debt and accumulate new debt.

- Actively manage their debt (refinance).
- Do not have a higher net worth.

- Active investors—owning stocks and a second home.
- Active borrowers: owe (various types of) debt and accumulate new debt.

- Actively manage their debt (refinance).
- Do not have a higher net worth.

- Active investors—owning stocks and a second home.
- Active borrowers: owe (various types of) debt and accumulate new debt.

- Actively manage their debt (refinance).
- Do not have a higher net worth.

Results Preview III: Excessive risk taking, active insuring

• More likely to drink, to drink heavily, and to smoke.

- More likely to pay (out-of-pocket) to buy life, health, and home insurance.
- Smoking and drinking do not generically predict buying insurance, such behaviors of gambler do.

Results Preview III: Excessive risk taking, active insuring

- More likely to drink, to drink heavily, and to smoke.
- More likely to pay (out-of-pocket) to buy life, health, and home insurance.
- Smoking and drinking do not generically predict buying insurance, such behaviors of gambler do.

Results Preview III: Excessive risk taking, active insuring

- More likely to drink, to drink heavily, and to smoke.
- More likely to pay (out-of-pocket) to buy life, health, and home insurance.
- Smoking and drinking do not generically predict buying insurance, such behaviors of gambler do.

- More than 50% of all consumers gamble in a given year.
- Gambling revenue topped \$100 billion.
- Most gambling games are unfair by design and winning chances are slim (WSJ).

- Then, why do people gamble at all?
 - Friedman and Savage
 - Bailey, Olson, and Wonnacott

- More than 50% of all consumers gamble in a given year.
- Gambling revenue topped \$100 billion.
- Most gambling games are unfair by design and winning chances are slim (WSJ).

- Then, why do people gamble at all?
 - Friedman and Savage
 - Bailey, Olson, and Wonnacott

- More than 50% of all consumers gamble in a given year.
- Gambling revenue topped \$100 billion.
- Most gambling games are unfair by design and winning chances are slim (WSJ).

▲□▶▲□▶▲□▶▲□▶ □ のQで

- Then, why do people gamble at all?
 - Friedman and Savage
 - Bailey, Olson, and Wonnacott

- Speak to the welfare effects on rank-and-file gamblers.
- Financial markets aversion (Amromin, Huang, and Sialm) versus personal finance activism

- Participation does not imply higher net worth
 - overconfidence (Barber and Odean, and many others)
- Gamblers' investment strategies (Kumar)
- A methodological innovation—use of survey paradata.

- Speak to the welfare effects on rank-and-file gamblers.
- Financial markets aversion (Amromin, Huang, and Sialm) versus personal finance activism

- Participation does not imply higher net worth
 - overconfidence (Barber and Odean, and many others)
- Gamblers' investment strategies (Kumar)
- A methodological innovation—use of survey paradata.

- Speak to the welfare effects on rank-and-file gamblers.
- Financial markets aversion (Amromin, Huang, and Sialm) versus personal finance activism

- コン・4回シュービン・4回シューレー

- Participation does not imply higher net worth
 - overconfidence (Barber and Odean, and many others)
- Gamblers' investment strategies (Kumar)
- A methodological innovation—use of survey paradata.

- Speak to the welfare effects on rank-and-file gamblers.
- Financial markets aversion (Amromin, Huang, and Sialm) versus personal finance activism

- Participation does not imply higher net worth
 - overconfidence (Barber and Odean, and many others)
- Gamblers' investment strategies (Kumar)
- A methodological innovation—use of survey paradata.

- Speak to the welfare effects on rank-and-file gamblers.
- Financial markets aversion (Amromin, Huang, and Sialm) versus personal finance activism

- ロト・ 日本・ モー・ モー・ うらく

- Participation does not imply higher net worth
 - overconfidence (Barber and Odean, and many others)
- Gamblers' investment strategies (Kumar)
- A methodological innovation—use of survey paradata.

• Beginning in 2001:Q2, the Consumer Expenditure Survey began asking: "In the last 3 months have you (or any members of your CU)

had expenses for lotteries and games of chance?"

- Pros of the data:
 - large nationwide representative survey
 - rich demographic and socioeconomic information and some balance sheet information

- very detailed expenditure data
- Cons of the data: gambling costs are measured inaccurately.

• Beginning in 2001:Q2, the Consumer Expenditure Survey began asking: "In the last 3 months have you (or any members of your CU)

had expenses for lotteries and games of chance?"

- Pros of the data:
 - large nationwide representative survey
 - rich demographic and socioeconomic information and some balance sheet information

- very detailed expenditure data
- Cons of the data: gambling costs are measured inaccurately.

• Beginning in 2001:Q2, the Consumer Expenditure Survey began asking: "In the last 3 months have you (or any members of your CU)

had expenses for lotteries and games of chance?"

- Pros of the data:
 - large nationwide representative survey
 - rich demographic and socioeconomic information and some balance sheet information

< □ > < 同 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > <

• very detailed expenditure data

• Cons of the data: gambling costs are measured inaccurately.

• Beginning in 2001:Q2, the Consumer Expenditure Survey began asking: "In the last 3 months have you (or any members of your CU)

had expenses for lotteries and games of chance?"

- Pros of the data:
 - large nationwide representative survey
 - rich demographic and socioeconomic information and some balance sheet information

< □ > < 同 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > <

• very detailed expenditure data

• Cons of the data: gambling costs are measured inaccurately.

• Beginning in 2001:Q2, the Consumer Expenditure Survey began asking: "In the last 3 months have you (or any members of your CU)

had expenses for lotteries and games of chance?"

- Pros of the data:
 - large nationwide representative survey
 - rich demographic and socioeconomic information and some balance sheet information
 - very detailed expenditure data
- Cons of the data: gambling costs are measured inaccurately.

Summary Statistics: Share of Gamblers and Gambling Expenditure

			Among gamblers		
% Gamblers	% Occasional	% Frequent	Gambling costs (\$)	Ratio to income (%)	
29.3	11.3	5.6	201 [57]	0.35 [0.13]	

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

Measurement Errors: Comparing with the NORC Statistics

CE statistics understate the prevalence and average expenditure of gambling.

- NORC data show 60% consumers gambled in a given year.
- Average lottery spending was \$200 per gambler.

Measurement Errors: Comparing with the NORC Statistics

CE statistics understate the prevalence and average expenditure of gambling.

- NORC data show 60% consumers gambled in a given year.
- Average lottery spending was \$200 per gambler.

Measurement Errors: Comparing with the NORC Statistics

CE statistics understate the prevalence and average expenditure of gambling.

- NORC data show 60% consumers gambled in a given year.
- Average lottery spending was \$200 per gambler.

Measurement Errors: What Factors Accounted for the Differences

- The CE is a general purpose survey that collects information on all aspects of household expenditures, not focusing gambling costs.
- The CE asks only one question on the total costs for all gambling activities.
- The CE asks one member on the expenditure of the household. In contrast, the NORC surveys individual consumers.

Measurement Errors: What Factors Accounted for the Differences

- The CE is a general purpose survey that collects information on all aspects of household expenditures, not focusing gambling costs.
- The CE asks only one question on the total costs for all gambling activities.
- The CE asks one member on the expenditure of the household. In contrast, the NORC surveys individual consumers.

▲□▶▲□▶▲□▶▲□▶ ▲□ ● のへで

Measurement Errors: What Factors Accounted for the Differences

- The CE is a general purpose survey that collects information on all aspects of household expenditures, not focusing gambling costs.
- The CE asks only one question on the total costs for all gambling activities.
- The CE asks one member on the expenditure of the household. In contrast, the NORC surveys individual consumers.

$$GC^{R} = \mathbb{P} \times \kappa \times GC^{T}, \qquad (1)$$

$\kappa < 1$ is a constant

 $\mathbb P$ is an indicator function that is equal to zero with probability $p(GC^T)$,



The gambler sample is not diluted. Measurement errors imply underestimating the "gambler's effects."

$$GC^{R} = \mathbb{P} \times \kappa \times \ GC^{T}, \tag{1}$$

 $\kappa < 1$ is a constant

 \mathbb{P} is an indicator function that is equal to zero with probability $p(GC^T)$,

 $\frac{dp}{d \ GC^T} < 0.$

The gambler sample is not diluted. Measurement errors imply underestimating the "gambler's effects."

$$GC^{R} = \mathbb{P} \times \kappa \times \ GC^{T}, \tag{1}$$

 $\kappa < 1$ is a constant

 \mathbb{P} is an indicator function that is equal to zero with probability $p(GC^T)$,



The gambler sample is not diluted. Measurement errors imply underestimating the "gambler's effects."

$$GC^{R} = \mathbb{P} \times \kappa \times \ GC^{T}, \tag{1}$$

 $\kappa < 1$ is a constant

 \mathbb{P} is an indicator function that is equal to zero with probability $p(GC^T)$,



The gambler sample is not diluted. Measurement errors imply underestimating the "gambler's effects."

Measurement Errors: validations

- Consumers in states without state lotteries have much lower gambling expenditure.
- Gambling costs increased noticeably in states after state lotteries were introduced (South Carolina 2002, Tennessee 2004, North Carolina 2004, and Arkansas 2009).

▲ロト ▲ □ ト ▲ □ ト ▲ □ ト ● ● の Q ()

- Consumers in states without state lotteries have much lower gambling expenditure.
- Gambling costs increased noticeably in states after state lotteries were introduced (South Carolina 2002, Tennessee 2004, North Carolina 2004, and Arkansas 2009).

▲ロト ▲ □ ト ▲ □ ト ▲ □ ト ● ● の Q ()

Do Gambling Costs Crowd out Other Expenditures? Cross-sectional Level Analysis

$Exp_i^{\ c} = \alpha + \beta GC_i + \gamma \widehat{\mathbb{Y}}_i + \theta Z_i + \xi Year_i + \varepsilon_i.$

 $\widehat{\mathbb{Y}}$ is the Mincer-equation imputed permanent income \widehat{Y} interacted with the decile it belongs to.

Z is a vector of demographic characteristics, with education and occupation being the excluded variables for instrumenting the permanent income.

Do Gambling Costs Crowd out Other Expenditures? Cross-sectional Level Analysis

$$Exp_i^{\ c} = \alpha + \beta GC_i + \gamma \widehat{\mathbb{Y}}_i + \theta Z_i + \xi Year_i + \varepsilon_i.$$

$\widehat{\mathbb{Y}}$ is the Mincer-equation imputed permanent income \widehat{Y} interacted with the decile it belongs to.

Z is a vector of demographic characteristics, with education and occupation being the excluded variables for instrumenting the permanent income.

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

Do Gambling Costs Crowd out Other Expenditures? Cross-sectional Level Analysis

$$Exp_i^{\ c} = \alpha + \beta GC_i + \gamma \widehat{\mathbb{Y}}_i + \theta Z_i + \xi Year_i + \varepsilon_i.$$

 $\widehat{\mathbb{Y}}$ is the Mincer-equation imputed permanent income \widehat{Y} interacted with the decile it belongs to.

Z is a vector of demographic characteristics, with education and occupation being the excluded variables for instrumenting the permanent income.

Exp. Category	All Households		All Gar	nblers
Total expenditure	3.02***	(0.35)	1.78***	(0.37)
Food	0.37***	(0.04)	0.28***	(0.04)
Alcohol	0.10***	(0.01)	0.07***	(0.01)
Tobacco	0.11***	(0.01)	0.07***	(0.01)
Apparel	0.18***	(0.02)	0.11***	(0.02)
Housing	0.60***	(0.13)	0.38***	(0.13)
Transportation	0.61***	(0.14)	0.24*	(0.15)
Health care	-0.00	(0.02)	-0.02	(0.02)
Entertainment	0.29***	(0.03)	0.15***	(0.03)
Personal care	0.03***	(0.00)	0.01***	(0.00)
Reading	0.01***	(0.00)	0.00	(0.00)
Education	-0.01	(0.03)	-0.01	(0.03)

 $\Delta Exp_{i,q}^{\ c} = \alpha + \beta \Delta GC_{i,q} + \theta_1 f(Age_i) + \theta_2 \Delta Famsize_{i,q} + \xi Year_i + \zeta Month_{i,q} + \varepsilon_{i,q},$

Exp. Category	All Households		All Gamblers		Frequent Gamblers	
Total expenditure	2.71***	(0.56)	2.68***	(0.60)	1.44	(1.27)
Food	0.37***	(0.07)	0.37***	(0.07)	0.45***	(0.14)
Alcohol	0.08***	(0.01)	0.08***	(0.01)	0.11***	(0.02)
Tobacco	0.02***	(0.01)	0.02*	(0.01)	0.03	(0.02)
Apparel	0.23***	(0.04)	0.23***	(0.04)	0.16**	(0.08)
Housing	0.21	(0.14)	0.20	(0.14)	0.14	(0.29)
Transportation	0.47	(0.42)	0.46	(0.46)	0.26	(1.01)
Health care	0.09*	(0.05)	0.09*	(0.05)	0.09	(0.10)
Entertainment	0.25***	(0.06)	0.25***	(0.06)	0.15	(0.11)
Personal Care	0.04***	(0.01)	0.04***	(0.01)	0.03**	(0.01)
Reading	0.01***	(0.00)	0.01***	(0.00)	0.01	(0.01)
Education	0.05	(0.05)	0.05	(0.05)	-0.02	(0.10)

Reconciling with Kearney



Gambling Exp.

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 - のへで

• $p(gamble) = \alpha + \beta [log(Y) - \widehat{log(Y)}] + \gamma \widehat{log(Y)} + \theta Z + \varepsilon$

▲□▶ ▲圖▶ ▲ 国▶ ▲ 国▶ - 国 - のへで

• $\beta = 0.32(\chi^2 > 100)$, whereas $\gamma = 0.02(\chi^2 = 0.25)$

•
$$p(gamble) = \alpha + \beta [log(Y) - \widehat{log(Y)}] + \gamma \widehat{log(Y)} + \theta Z + \varepsilon$$

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

•
$$\beta = 0.32(\chi^2 > 100)$$
, whereas $\gamma = 0.02(\chi^2 = 0.25)$

Average Propensity to Consume

	Nongamblers	Gamblers
Relative to \widehat{Y}	88.3%	97.6%
Relative to Y	96.2%	93.0%
Memo: $log(Y) - \widehat{log(Y)}$	-0.033 (0.005)	0.072 (0.004)

Implications: Consumers tend to gamble when their income is higher than it normal levels.

▲□▶ ▲圖▶ ▲ 国▶ ▲ 国▶ - 国 - のへで

"When you buy DC lotteries, lots of people win!" "Benefitting New Mexico's future"

	Logistic regression Probability of making a donation		OLS regress Va	OLS regression (subsample of donors) Value of donations		
	Charitable	Religious	Political	Charitable	Religious	Political
Gambler	0.62*** (0.03) [1.85]	0.02 (0.03) [1.02]	0.13** (0.06) [1.13]	-97.3*** (30.3)	-616.2*** (48.2)	-121.9 (80.1)

▲□▶▲□▶▲□▶▲□▶ □ のQで

Summary Statistics of Household Balance Sheets

	Nongamblers	Gamblers
Assets ownership Liquid financial assets Securities ownership(%)	12,942 14.0	16,104 21.6
Home ownership (%) Homeowners with a second home (%)	71.8 6.5	75.5 7.7
Car owners leasing a car (%)	4.4	5.7
Household debt Homeowners having refinanced (%) Have credit card debt (%) Have added credit card debt (%) "Credit card puzzle" (%)	31.3 35.4 21.9 8.9	37.9 47.2 27.8 13.5
Partial net worth [†]	163,005	164,399
Annual income	57,392	62,527

Do gamblers trade stocks more often?

A rider on the Household Financial Stability Survey (currently in the field)

◆□▶ ◆□▶ ◆ □▶ ◆ □▶ ● □ ● ● ● ●

	Risky Behavior		Insurance		
	Heavy drinker	Smoker	Health	Life	Home
Gambler	0.72***	0.58***	0.17***	0.39***	0.27***
	(0.05)	(0.03)	(0.03)	(0.03)	(0.07)
	[2.06]	[1.79]	[1.19]	[1.47]	[1.31]
Memo: propensity among nongamblers (%)	4.9	29.5	44.7	45.4	57.8

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

Concurrent behavior	Health insurance	Life insurance	Health insurance	Life insurance
	(1)	(2)	(3)	(4)
Smoker	-0.09***	-0.19***		
	(0.03)	(0.03)		
	[0.91]	[0.83]		
Smoker \times gambler	0.19***	0.29***		
	(0.04)	(0.05)		
	[1.21]	[1.34]		
Drinker			0.16**	0.06
			(0.07)	(0.07)
			[1.17]	[1.07]
Drinker \times gambler			0.15	0.18*
e			(0.10)	(0.07)
			[1.16]	[1.19]

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへで



- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

< □ > < 同 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > <

- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

(ロ)、(型)、(E)、(E)、(E)、(O)へ(C)

- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

- An alternative explanation of our findings is that gamblers observed in the CE data are more careful survey participants.
- We argue that different carefulness of survey responses is unlikely the main reason for the observed differences between gamblers and nongamblers.
- Use the paradata of the CE.
- Gamblers and nongamblers are similar regarding referring to documents when responding to the survey.
- Gamblers on average have longer survey time. However, trimming the nongamblers with short survey time, our results are qualitatively the same.

◆□▶ ◆□▶ ◆ □▶ ◆ □▶ ─ □ ● のへぐ

- Hopefully, I have convinced you that the paper is not merely about gambling and gamblers
- It speaks to some deep and under-explored aspects of preferential and behavioral traits of consumers.

▲□▶ ▲□▶ ▲ □▶ ▲ □▶ ▲ □ ● ● ● ●

- Hopefully, I have convinced you that the paper is not merely about gambling and gamblers
- It speaks to some deep and under-explored aspects of preferential and behavioral traits of consumers.