Background	Motivating Empirics	Main Results	Conclusion

# When Saving is Gambling

J. Anthony Cookson

University of Colorado at Boulder

FTC Microeconomics Presentation

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- Some investors seek lottery-style stocks (Kumar 2009).
  - Highly skewed, high variance, lower return.
  - Problematic if... "financial gambling" crowds out textbook investing.
  - But, what if ... "financial gambling" crowds out gambling?

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### Two Challenges:

- Good data on gambling are hard to find.
- Output: Lottery-style financial products do not usually happen randomly.

### • This Paper:

- New data on casino gambling
- Quasi-random assignment of lottery-like savings accounts.
  - Distinct from using lotteries as a source of randomness.

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Save to Win was introd	Iuced to Nebraska in 2012		

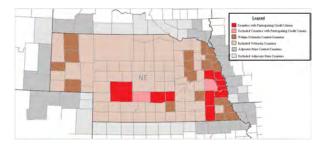
- Lottery instead of fixed rate of interest.
  - Monthly raffles: An entry per \$25 deposit in one-year CD.



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Background	Motivating Empirics	Main Results	Conclusion
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Empirical Settir Save to Win was introd	ng Juced to Nebraska in 2012		

- Only available at participating credit unions.
  - Targeted: 10/93 Nebraska counties and 9/68 credit unions.
  - Control regions just across the border.



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Background	Motivating Empirics	Main Results	Conclusion
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Casino Cash / Proprietary Transact			

### • Cash withdrawals at U.S. casinos (May 2010 - June 2012).

- US: 12 million transactions across 2 million patrons.
- Greater Nebraska: 54,000 transactions across 12,000 patrons.
- Detailed data on cash withdrawals
  - <u>Transactions</u>: Timestamp, amount withdrawn, failed transactions, and method of withdrawal (credit, debit, etc.).
  - Patrons: Home ZIP code, gender and age.
  - Casinos: Location, amenities, and size.

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Preview of Find	dings		

Savings lotteries substitute for casino gambling.

- Magnitude: 1/2 of cash withdrawals, 1/9 of reported saving in STW accounts.
- Extensive Margin: affected patrons are 15.4 pp more likely to not visit a casino at all in the post period.
- ② Larger effects when savings lotteries are more like gambling.
  - Stronger effects for local gambling, dates when raffle is near, and low amenity casinos.
- I Effect is concentrated among the financially aware:
  - Stronger effects for patrons with lower "not sufficient funds" rates, and patrons who tend to pay low fees.

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Similar attributes / categories of consumption.

- Attribute-based substitution?
- Mental accounting?

Omplementarity among gambles.

 Yes, but in this context, not as likely as other contexts (dopamine responses are not as likely to create a feedback).

Is Behaviorally – why should lotteries substitute for gambling?

 Barberis (2012): prospect theory, sequence of gambles looks like a lottery payoff.

Strong prediction: sophisticates substitute more strongly.

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Sample C	Sample Coverage Statistics				

### Table: Characteristics of Sample and Region

	Nebraska	Adjacent to Nebraska
# of Transactions	26,312	28,053
# of Casino Patrons	5722	6033
2010 Population (1000s)	1484.38	833.42
Average Per Capita Income (\$1000s)	37.61	37.19

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- Use cash access data to measure casino demand by county and month.
- Observe the effect of being treated by availability of savings lotteries: difference-in-difference estimate.

	Treated	<u>Not Treated</u>
# of Counties	10	44
# of Months	26	26
# of Observations	207	1183
Before	159	907
After	48	276

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Background

Main Results 00000000

# Balance of Attributes

	Treated	Not Treated
Mean Transaction Amount (\$)	537.40	453.97
Mean $\#$ of Transactions	63.85	25.27
% Male	58.44	55.10
% Not Sufficient Funds	14.45	11.53
% Use Credit Card for Cash	54.96	40.18
% Daytime Transactions	34.22	35.91
% Weekend Transactions	46.41	48.54
Per Capita Personal Income (\$1000s)	41.54	39.91
Population (1000s)	122.25	25.47
% with Population $> 100,000$	30.15	4.61

- Treated counties are bigger and use credit card for cash more often.
  - Condition on population and income in empirical tests.
  - Placebo: do credit unions affect credit card usage?

Background	

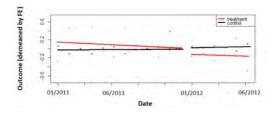
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No Significar	nt Pre-Trends		



• Robustness also allows for different pre-trends by large population and low unemployment regions.

Background 000000	Motivating Empirics	Main Results	Conclusion 00
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### Table: Dependent Variable: logged cash withdrawals

	(1)	(2)
post $\times$ # of participating CUs	-0.188***	-0.197***
	(0.047)	(0.049)
# of participating CUs	-0.132	
	(0.097)	
Population and Income Controls	х	х
Month-Year FE	х	х
County FE		х
	0.488	0.675
N	1390	1390

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

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Background	Motivating Empirics	Main Results	Conclusion
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Robustness Ch Estimated effect size	necks ranges from 10.4 pp to 20	.4 pp.	

### Table: Dependent Variable: logged cash withdrawals

Robustness Test	Estimated Effect
Within Nebraska Controls Only	-0.135**
	(0.062)
Adjacent to Nebraska Controls Only	$-0.185^{***}$
	(0.055)
Only January through June Observations (seasonality)	$-0.137^{***}$
	(0.049)
Difference Relative to 2011 Trend	-0.104**
	(0.049)
Diffential Trend by $>$ 50,000 residents	$-0.133^{**}$
	(0.058)
Diffential Trend by $> 100,000$ residents	$-0.164^{**}$
	(0.064)
Diffential Trend by > median unemployment	$-0.195^{**}$
	(0.058)
Diffential Trend by > 90th percentile unemployment	$-0.176^{**}$
	(0.050)
Controlling for Jackpot Lottery Sales	-0.204**
	(0.048)

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.  $\langle \Box \rangle \langle \Box \rangle \langle \Xi \rangle$ 

Background 000000	Motivating Empirics	Main Results 00●00000	Conclusion 00
	agnitude of the Effect	:	

- The effect is 24.98 percent (2.402 × 0.104) of cash withdrawals using the smallest estimate.
- Relative to total gambling cash:
  - Effect is -8.3 percent if one dollar is brought per dollar accessed at the casino.
  - <u>Call report data</u>: +5.7 percent (\$2.3 million) in deposits at STW credit unions versus not.
- Dollar for dollar substitution is approximately \$100 for the median patron.
  - STW White Paper: \$857 in PLS deposits by July.

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	th Other Lotteries thdrawals. Lottery substitut		ar-for-dollar

#### Table: Dependent Variable: logged expenditure on scratch tickets

	(1)	(2)
post $\times$ # of participating CUs	-0.025***	-0.018***
	(0.009)	(0.006)
Game  imes Month-Year FE	х	х
County FE	х	
ZIP Code FE		х
	0.556	0.714
# of Counties	35	35
# of Months	24	24
# of Games	13	13
N	2006	2006

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.  $\langle \Box \rangle \langle \Box \rangle \langle \Xi \rangle$ 

Background 000000	Motivating Empirics	Main Results ○○○○●○○○
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Conclusion 00

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### Heterogeneity Resembles Substitution Stronger substitution when savings lotteries and casino gambling are similar.

### Table: Dependent Variable: logged cash withdrawals

Sample Split	Estimated Effect
Similar	
Close Transactions (within 120 miles)	-0.222**
	(0.101)
Short Time Until Lottery (week 4 transactions)	-0.239***
	(0.083)
Casinos without Nightlife	-0.218***
-	(0.055)
Differentiated	
Far Transactions (outside of 120 miles)	-0.063
	(0.086)
Long Time Until Lottery (week 1 transactions)	-0.157
	(0.113)
Casinos with Nightlife	0.053**
	(0.024)

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Stronger Subs	titution among So	ophisticates	

More sophisticated are more prone to substituting.

### Table: Dependent Variable: logged cash withdrawals

Sample Split	Estimated Effect
Sophisticated	
Infrequent Use of Credit Card for Cash	-0.329**
	(0.076)
Never Use a Credit Card for Cash	-0.247***
	(0.092)
Infrequently Requesting Unavailable Funds	-0.353***
	(0.066)
Not Sophisticated	
Frequent Use of Credit Card for Cash	-0.017
	(0.076)
Use a Credit Card for Cash	-0.039
	(0.092)
Frequently Requesting Unavailable Funds	-0.039
· · · · · ·	(0.066)

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Substitution at	the Patron Level		

	Log(Cash Withdrawn)		No Withdrawals Dummy		Log(	Fees)
	(1)	(2)	(3)	(4)	(5)	(6)
post $\times$ # of participating CUs	-0.156***		0.036***		0.007	
	(0.055)		(0.007)		(0.016)	
post $ imes$ STW Accounts Available		-0.674***		0.154***		0.004
		(0.223)		(0.026)		(0.074)
ZIP Code FE	x	x	х	х	х	х
	0.149	0.150	0.479	0.479	0.404	0.404
# of ZIP Codes	482	482	654	654	482	482
N	7262	7262	18730	18730	7262	7262

ZIP code clustered standard errors in parentheses. \* \* \*, \*\*, and \*indicate statistical significance at the one, five, and ten percent level.

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Robustness	and Placebos		

### The effect...

- is unrelated to daytime or weekend gambling.
- does not change credit card usage or the frequency of not sufficient funds. Table
- is robust to using distance to credit union rather than treatment/control. Table
- is greater for patrons who gamble more (quantile regressions).

Background	Motivating Empirics	Main Results	Conclusion
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Discussion Two main takeaways			

- In this context, "financial gambling" and gambling are substitutes.
  - Maybe utilizing gambling motives to increase saving is welfare enhancing.
- Innovative financial products do not (completely) substitute for financial education.
  - Greater awareness enhances the effectivenss of innovative financial products when takeup matters.

Background	Motivating Empirics	Main Results	Conclusion
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Thank you			

## Thank you!

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# Sample Composition: Characteristics

#### Back

	% Daytime	% Weekend	% Male
post $\times$ # of participating CUs	0.000	-0.008	0.038*
	(0.005)	(0.005)	(0.023)
Month-Year FE	х	х	х
County FE	х	х	х
$R^2$	0.088	0.112	0.339
# of Counties	54	54	54
# of Months	26	26	26
Ν	1390	1390	1091

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

## Sample Composition: Behavior

#### Back

	% NSF	% Credit Card
post $\times$ # of participating CUs	0.004	0.011
	(0.006)	(0.010)
Month-Year FE	х	x
County FE	х	х
$R^2$	0.193	0.447
# of Counties	54	54
# of Months	26	26
N	1390	1390

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

# Controlling for Differential Pre-Trends by Urban/Rural



	Pre-Trends by 50,000 residents			Pre-Trend	s by 100,00	) residents
	(1)	(2)	(3)	(4)	(5)	(6)
post $\times$ # of participating CUs	-0.120**	-0.120**	-0.133**	$-0.154^{**}$	$-0.153^{**}$	-0.164**
	(0.054)	(0.055)	(0.058)	(0.060)	(0.061)	(0.064)
Month-Year FE		х	х		x	x
County FE			x			x
R <sup>2</sup>	0.472	0.500	0.678	0.491	0.519	0.676
# of Counties	54	54	54	54	54	54
# of Months	26	26	26	26	26	26
N	1390	1390	1390	1390	1390	1390

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

# Controlling for Jackpot Lottery Sales

#### Back

	Full S	Full Sample		braska Sample
	(1)	(2)	(3)	(4)
post $\times$ # of participating CUs	$-0.197^{***}$	-0.204***	$-0.129^{*}$	$-0.137^{*}$
	(0.049)	(0.048)	(0.067)	(0.074)
log(jackpot_sales)		-0.373		-1.041
		(0.312)		(1.554)
Month-Year FE	х	х	х	x
County FE	х	х	х	х
Dummy for Missing		x		
R <sup>2</sup>	0.675	0.676	0.662	0.663
# of Counties	54	54	26	26
# of Months	26	26	26	26
N	1390	1390	629	629

County clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

# Distance to Credit Union

#### Back

	Logged Withdrawal Amount		Indicato	ndrawals		
	(1)	(2)	(3)	(4)	(5)	(6)
post $\times$ log(distance)	0.148**			-0.036***		
nearest branch	(0.051)			(0.006)		
post $\times$ log(distance)		0.141*			-0.043***	
nearest five branches		(0.071)			(0.008)	
post $\times$ log(distance)			0.149*			-0.040***
nearest headquarters			(0.063)			(0.009)
ZIP Code FE	х	х	х	х	х	x
R <sup>2</sup>	0.149	0.147	0.148	0.480	0.480	0.480
# of ZIP Codes	482	482	482	653	653	653
Ν	7262	7262	7262	18728	18728	18728

ZIP clustered standard errors in parentheses. \*\*\*, \*\*, and \* indicate statistical significance at the one, five, and ten percent level.

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