# Retail Payment Innovations and Cash Usage: <br> Accounting for Attrition Using Refreshment Samples 

Heng Chen (Bank of Canada)
Marie-Hélène Felt (Carleton University)
Kim P. Huynh (Bank of Canada)

5 June 2015
European Central Bank/Suomen Pankki Conference
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## Cashless Society?

- Retail payment innovations: contactless credit card (CTC), multi-purpose and single-purpose stored-value card (SVCm and SVCs).
- These innovations are fast, easy to use and gaining acceptance.
- Will these innovations replace cash? Are we headed towards the cashless society?


## Our Contributions

- Estimate the impact of retail payment innovations (PI) on cash usage:

$$
C R_{i t}=\alpha_{i}+\beta \cdot P l_{i t}+X_{i t} \cdot \gamma+u_{i t}
$$

where $C R$ denotes the cash usage (volume \& value), $\alpha$ is unobserved heterogeneity, and $X$ are demographic variables.

- Accounting for unobserved heterogeneity and non-random attrition results in about $\approx-3 \%$ smaller than cross-sectional estimates $(\approx-10 \%)$.

Table 5: CTC cash ratios by value (in percent)
201020112012

|  | 2010 |  | 2011 |  | 2012 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $U$ | $N-U$ | $U$ | $N-U$ | $U$ | $N-U$ |
| Overall | 13 | 23 | 12 | 23 | 12 | 23 |

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| Overall | 13 | 23 | 12 | 23 | 12 | 23 |
| Age: $18-34$ | 12 | 24 | 12 | 22 | 11 | 23 |
| $35-49$ | 12 | 23 | 11 | 22 | 10 | 22 |
| $50-64$ | 13 | 22 | 13 | 23 | 13 | 23 |
| $65+$ | 14 | 24 | 12 | 23 | 13 | 24 |

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| $65+$ | 14 | 24 | 12 | 23 | 13 | 24 |
| Income: $<25 \mathrm{~K}$ | 21 | 35 | 18 | 37 | 20 | 36 |
| $25-34 \mathrm{~K}$ | 19 | 30 | 15 | 28 | 19 | 28 |
| $35-44 \mathrm{~K}$ | 15 | 25 | 18 | 24 | 12 | 26 |
| $45-59 \mathrm{~K}$ | 15 | 23 | 14 | 22 | 13 | 21 |
| $60-69 \mathrm{~K}$ | 13 | 20 | 10 | 21 | 13 | 19 |
| $70+\mathrm{K}$ | 9 | 16 | 9 | 15 | 9 | 16 |

Note: CTC users ( U ) and non-users ( $\mathrm{N}-\mathrm{U}$ ).

## Rotating Panel (Attrition)

- We exploit the panel dimension of Canadian Financial Monitor (CFM) from 2010 to 2012
- Survey on household finances; 12,000 households each year.
- Attrition rate above $50 \%$ !
- Data replenished annually to maintain a constant yearly sample size and make each year's representative.

Table 8: Attrition and refreshment in the CFM

| Panels | $2010-11$ | $2011-12$ |
| :--- | :---: | :---: |
| Beginning sample size: | 11,695 | 12,241 |
| Stayers | 5,699 | 6,079 |
| - Attritors | 5,996 | 6,162 |
| + Refreshment sample | 6,542 | 4,944 |
| End sample size | 12,241 | 11,023 |

## Without Correcting for Attrition

When attrition is missing-completely-at-random (MCAR):

$$
\begin{equation*}
E\left[\Delta C R-\beta \cdot \Delta P I-\Delta X \cdot \gamma \mid S=1, x_{t-1}, x_{t}\right]=0 \tag{1}
\end{equation*}
$$

where $S=0$ for attritors and $S=1$ for stayers.

- Test: Moffit, Fitzgerald, and Gottschalk (1999).
- Reject the MCAR hypothesis, thus we focus on other attrition models.


## Correcting for Non-random Attrition

$$
\begin{equation*}
E\left[\left.\frac{\Delta C R-\beta \cdot \Delta P I-\Delta X \cdot \gamma}{g(\cdot)} \right\rvert\, S=1, x_{t-1}, x_{t}\right]=0 \tag{2}
\end{equation*}
$$

Survival function: $g(\cdot) \equiv \operatorname{Pr}\left(S=1 \mid z_{1}, z_{2}\right)$, where $z_{t} \equiv\left\{C R_{t}, P I_{t}, X_{t}\right\}$.

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Two-period model

| $\mathbf{T}=\mathbf{1}$ | $\mathbf{T}=\mathbf{2}$ |
| :---: | :---: |
| $\left(X_{1}, Y_{1}\right)$ | $\left(X_{2}, Y_{2}\right)$ |
| Stayers |  |
| Attritors |  |
|  | Refreshers |

(1) Missing-at-random (MAR): $g\left(k_{1}\left(z_{1}\right)\right)$.
(2) Selection-on-unobservables (HW): $g\left(k_{2}\left(z_{2}\right)\right)$.
(3) Additive Non-ignorable (AN): $g\left(k_{1}\left(z_{1}\right)+k_{2}\left(z_{2}\right)\right)$.

## Three-period AN Model

Define $S_{2} S_{3}=1$ if a unit observed in the initial sample (period 1) survives both in periods 2 and 3 .
The survival function

$$
\operatorname{Pr}\left(S_{2} S_{3}=1 \mid z_{1}, z_{2}, z_{3}\right) \equiv g\left(k_{1}\left(z_{1}\right)+k_{2}\left(z_{2}\right)+k_{3}\left(z_{3}\right)\right)
$$

is identified as

$$
\begin{aligned}
& E\left[\left.\frac{S_{2} S_{3}}{g\left(k_{1}\left(z_{1}\right)+k_{2}\left(z_{2}\right)+k_{3}\left(z_{3}\right)\right)}-1 \right\rvert\, R_{1}=1, z_{1}\right]=0, \\
& E\left[\left.\frac{S_{2} S_{3}}{g\left(k_{1}\left(z_{1}\right)+k_{2}\left(z_{2}\right)+k_{3}\left(z_{3}\right)\right)}-1 \right\rvert\, R_{2}=1, z_{2}\right]=0, \\
& E\left[\left.\frac{S_{2} S_{3}}{g\left(k_{1}\left(z_{1}\right)+k_{2}\left(z_{2}\right)+k_{3}\left(z_{3}\right)\right)}-1 \right\rvert\, R_{3}=1, z_{3}\right]=0,
\end{aligned}
$$

where the dummy $R_{t}$ indicates whether a unit belongs to the representative sample in period $t$, for $t=1,2,3$.

Figure 8: Results for CTC (Value)


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## Understanding the results

Correcting for attrition $(1 / g(\cdot))$ may affect the estimated $\widehat{\beta}$ through different channels:

$$
E\left[\left.\frac{\Delta C R-\beta \cdot \Delta P I-\Delta X \cdot \gamma}{g(\cdot)} \right\rvert\, S=1, x_{t-1}, x_{t}\right]=0
$$

- Extensive margin: Switchers $\Delta P I \neq 0$ vs. non-switchers $\Delta P I=0$.
- Intensive margin: $\triangle C R$ associated with New-users $\triangle P I=1$ vs. stop-users $\Delta P I=-1$.
- Survival probability: $1 / g(\cdot)$

Figure 2: 2010-2012: $\widehat{g}(\cdot)$ versus $\Delta C R$ value for CTC


Note: Left side pane: never-users $(0,0)$ in grey, always-users $(1,1)$ in black; Right side pane: stop-users $(1,0)$ in grey, new-users $(0,1)$ in black.

Figure C.4: 2010-2011: $\widehat{g}(\cdot)$ versus $\triangle C R$ value for CTC


Note: Left side pane: never-users $(0,0)$ in grey, always-users $(1,1)$ in black; Right side pane: stop-users $(1,0)$ in grey, new-users $(0,1)$ in black.

Figure C.4: 2011-2012: $\widehat{g}(\cdot)$ versus $\Delta C R$ value for CTC


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## Contactless S-curve?



15/17

## Cross-Validation



2009/2013 Bank of Canada Methods-Of-Payment Diaries.

## Summary

- CTC are displacing cash (and debit card) usage.
- In terms of value it is about 0-3\% per annum.
- Monitor situation - tipping point of S-curve?
- 2015 Merchant Cost Study $\Rightarrow 2$-sided markets.


## Thanks/Merci/Kiitos!!!

